

Beta

# Selecting a {"no":"SQL"} database from a menu of over 200 products

Akmal B. Chaudhri

(艾克摩 曹理)

# Why it's important



*Half of the “NoSQL” databases and “big data” technologies that are hot buzzwords won’t be around in 15 years.*

-- Michael O. Church

# Agenda



# In a packed program ...

- Introduction
- Market analysis
- NoSQL
- Security and vulnerability
- Polyglot persistence
- Benchmarks and performance
- BI/Analytics
- NoSQL alternatives
- Summary
- Resources

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# Introduction

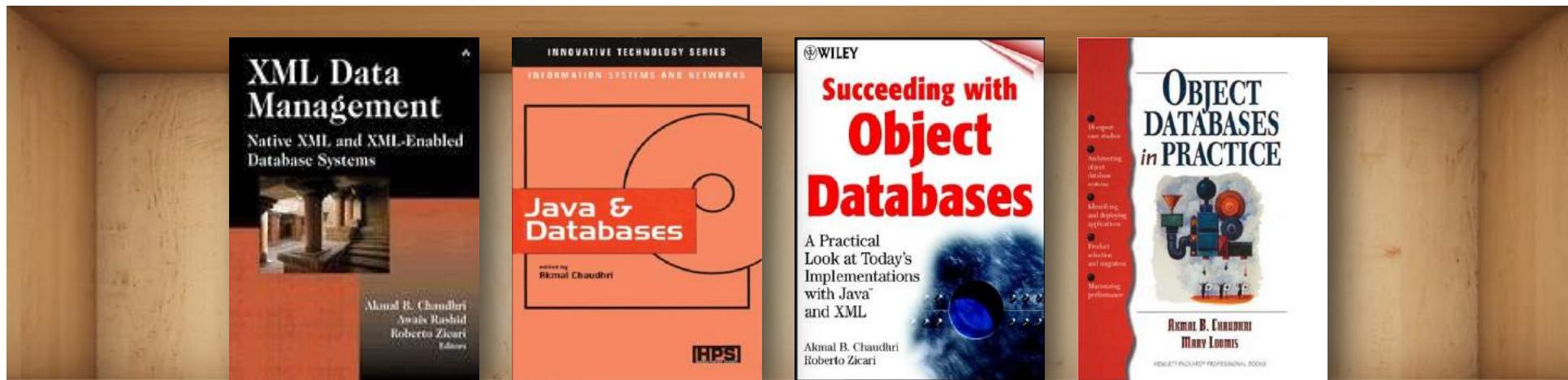


# My background

- ~25 years experience in IT
  - Developer (Reuters)
  - Academic (City University)
  - Consultant (Logica)
  - Technical Architect (CA)
  - Senior Architect (Informix)
  - Senior IT Specialist (IBM)
  - TI (Hortonworks)
  - SA (DataStax)
- Worked with various technologies
  - Programming languages
  - IDE
  - Database Systems
- Client-facing roles
  - Developers
  - Senior executives
  - Journalists
- Broad industry experience
- Community outreach
- University relations
- 10 books, many presentations

# Full disclosure

- Worked for
  - DataStax
- Consulted for
  - MongoDB
  - VoltDB



# Old Java user group



- London JSIG was amongst the top 25 Java User Groups in the world, as voted by members

# History

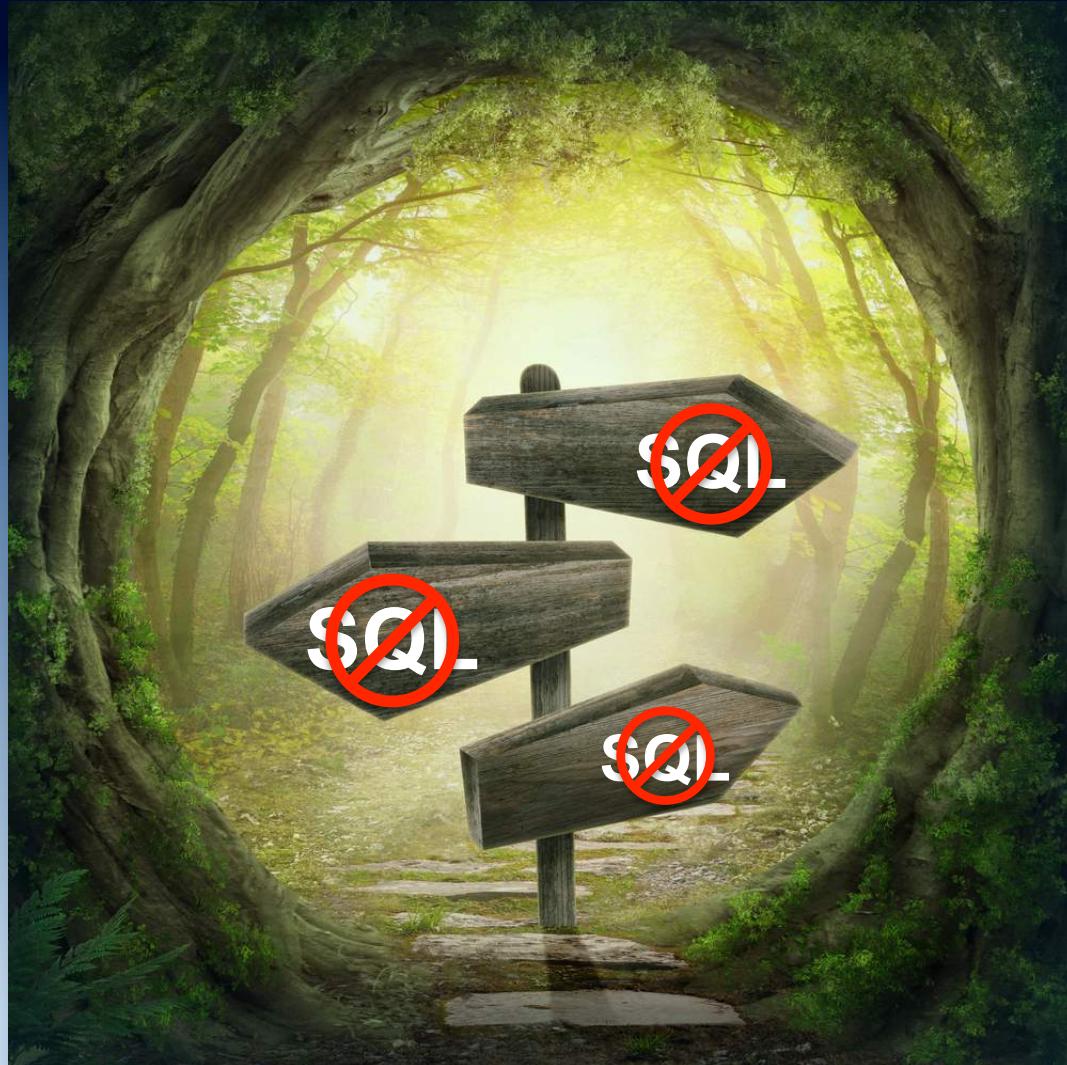


*Have you run into limitations with traditional relational databases? Don't mind trading a query language for scalability? Or perhaps you just like shiny new things to try out? Either way this meetup is for you.*

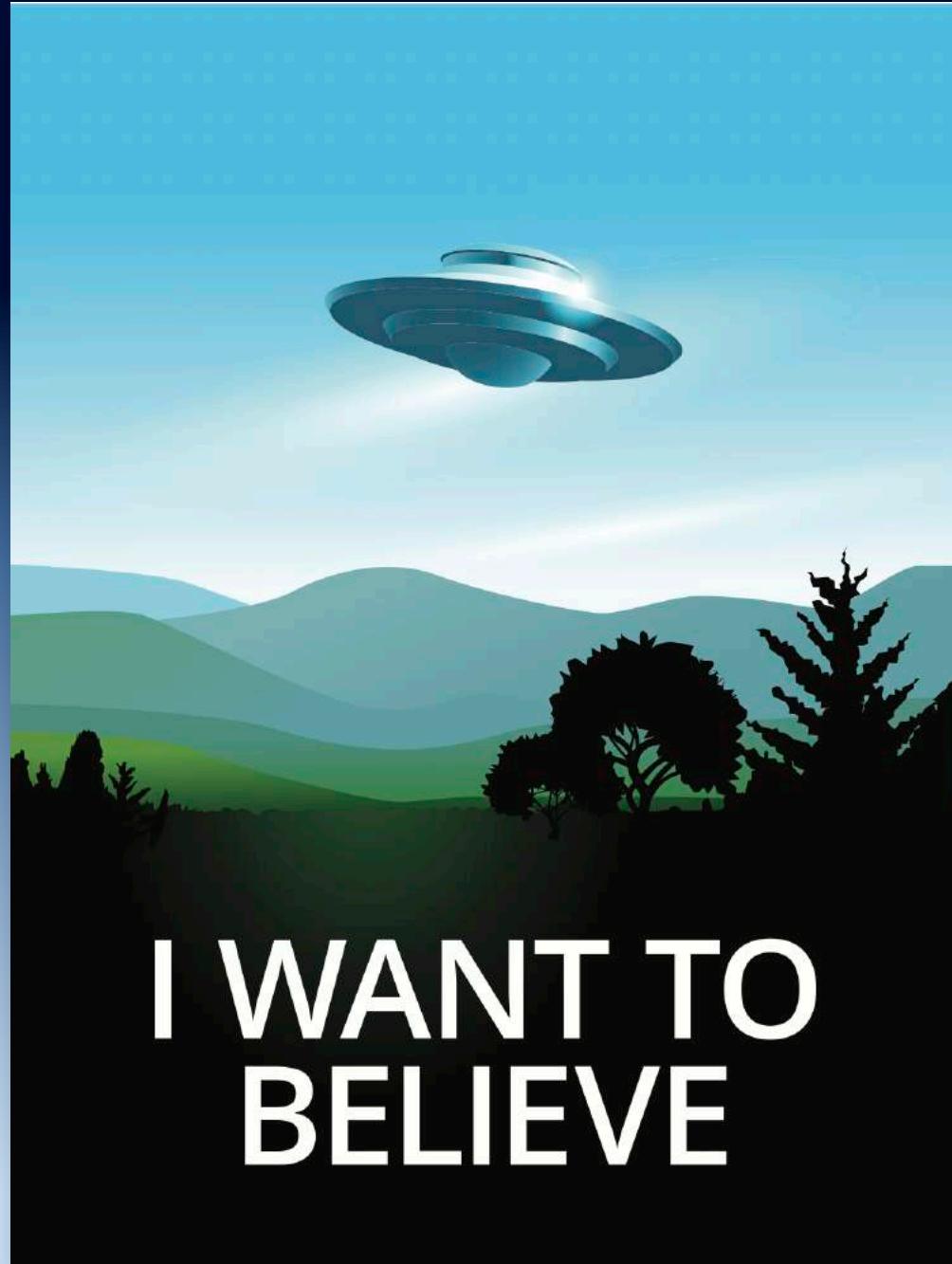
*Join us in figuring out why these new fangled Dynamo clones and BigTables have become so popular lately.*



# Your path leads to NoSQL?

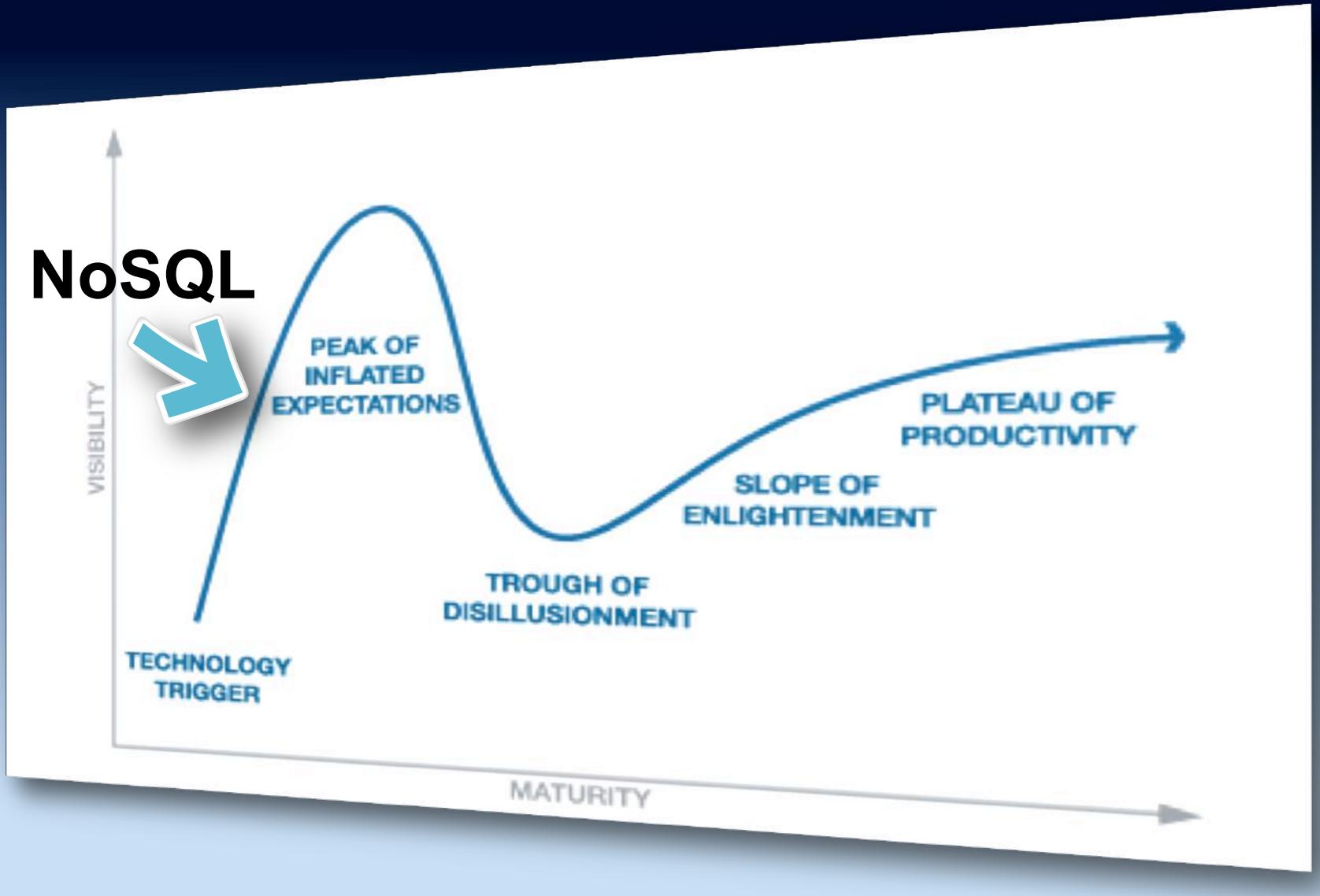


Source: Shutterstock Image ID 159183185



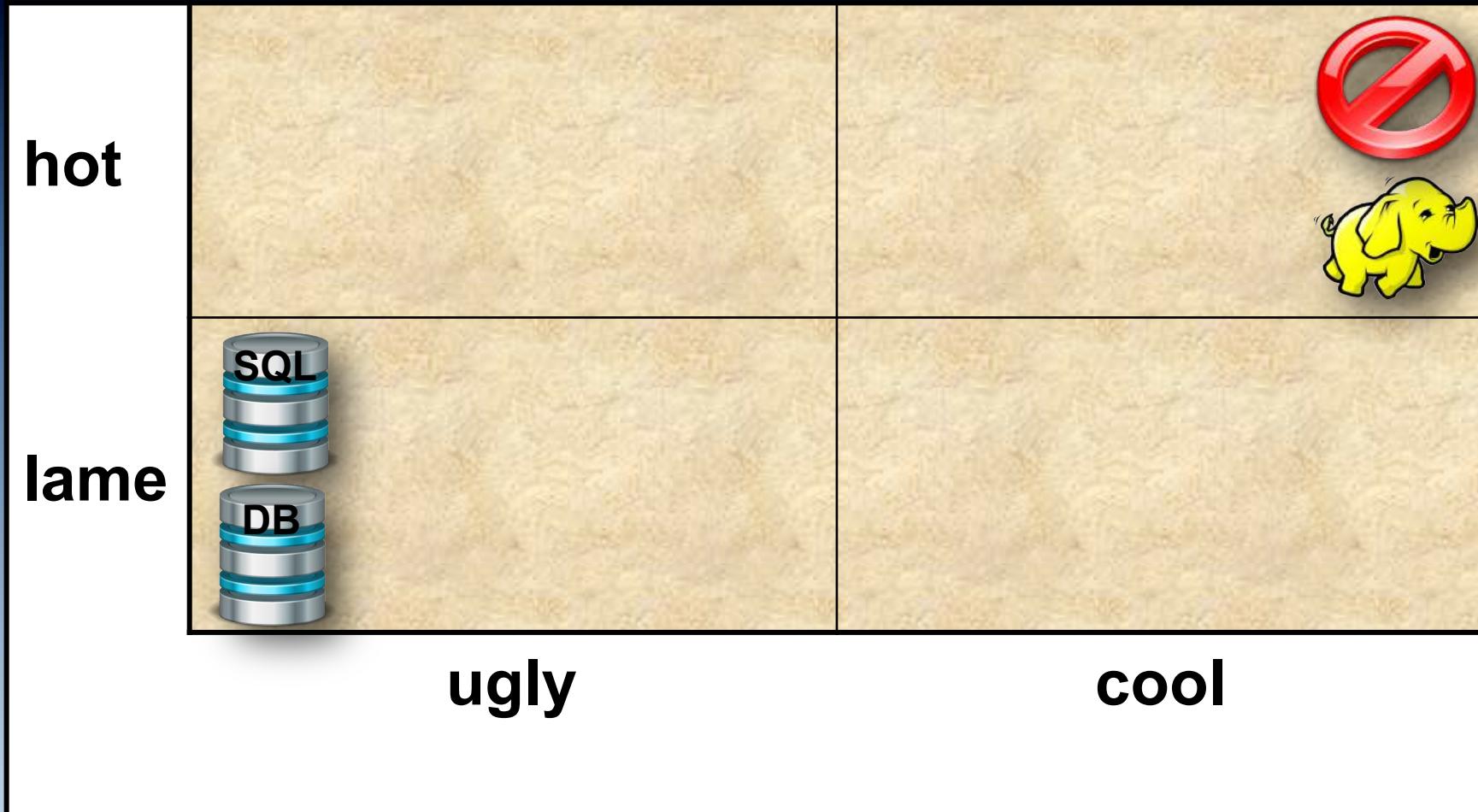
Source: Shutterstock Image ID 99862922

# Gartner hype curve



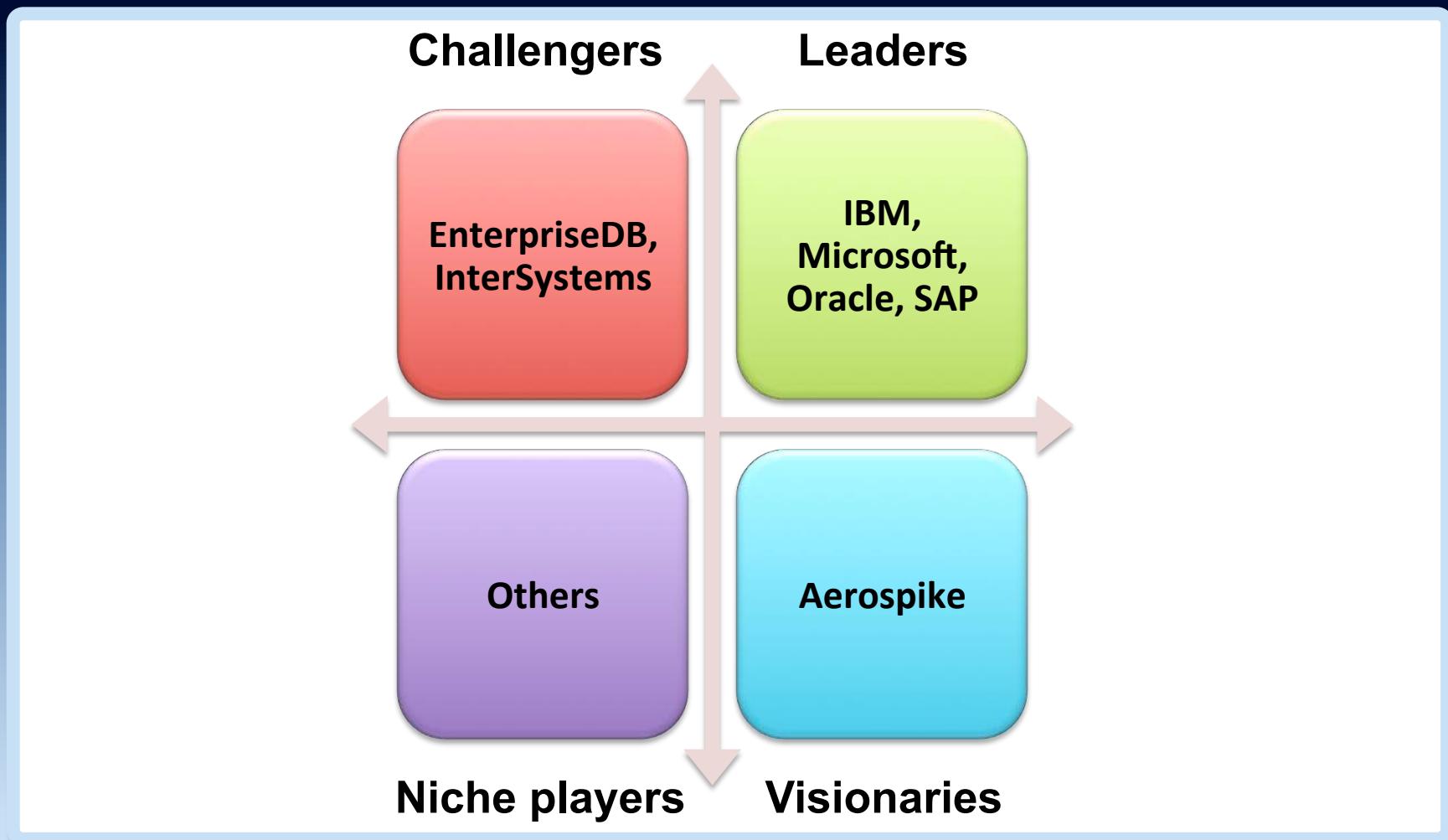


# Magic quadrant



Source: After “say No! No! and No! (=NoSQL Parody)” Jens Dittrich (2013)

# Magic quadrant 2013



Source: "Magic Quadrant for Operational Database Management Systems" Gartner (21 October 2013)

# Magic quadrant 2014



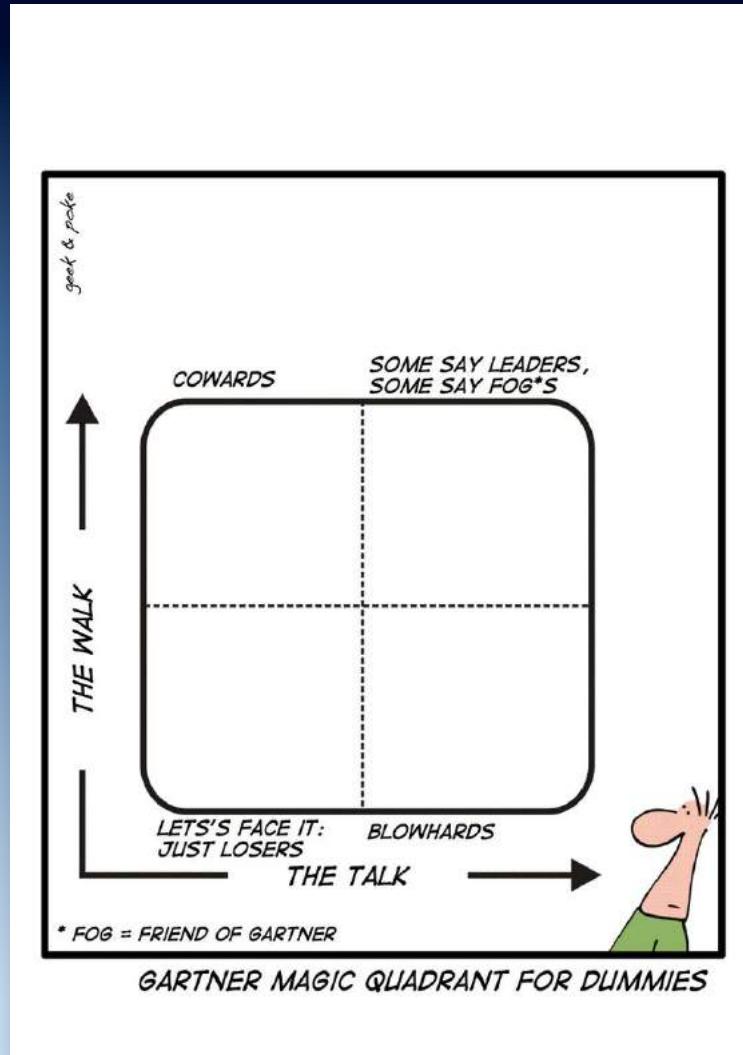
Source: "Magic Quadrant for Operational Database Management Systems" Gartner (16 October 2014)

# Magic quadrant 2015



Source: "Magic Quadrant for Operational Database Management Systems" Gartner (12 October 2015)

# Magic quadrant for dummies



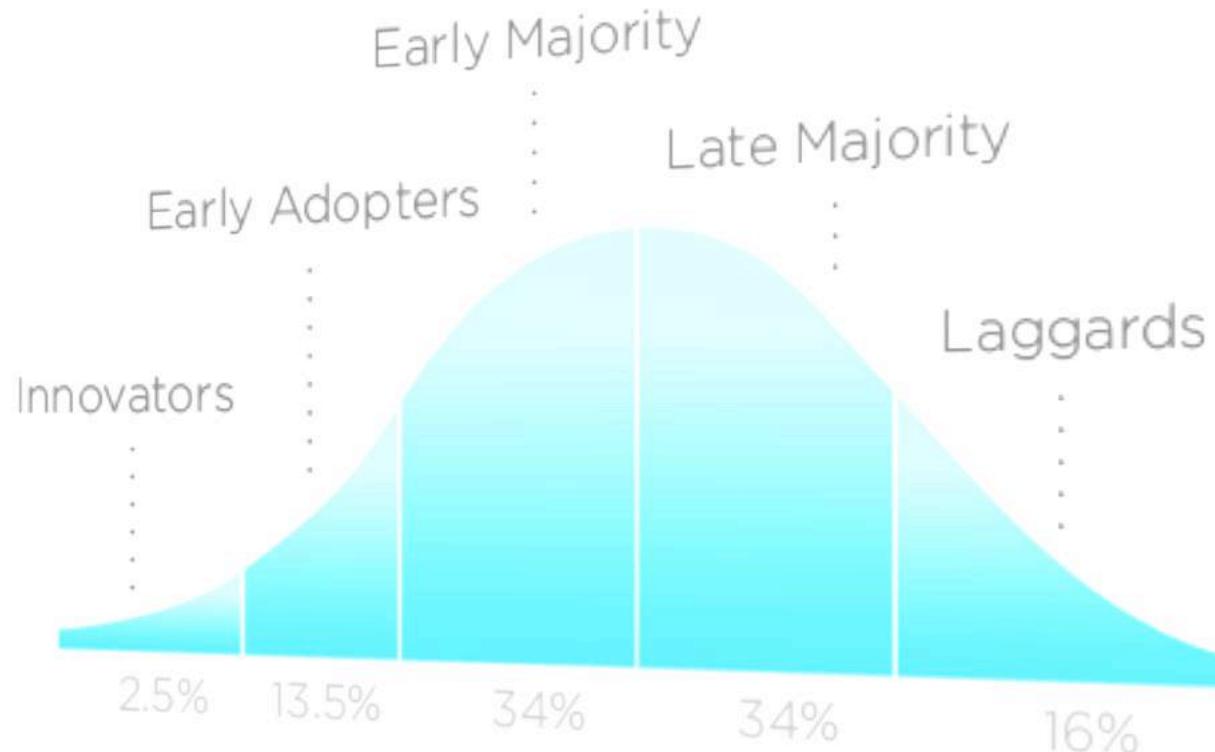
Source: Oliver Widder, used with permission

# G2 Crowd Grid for NoSQL



Source: G2 Crowd, used with permission

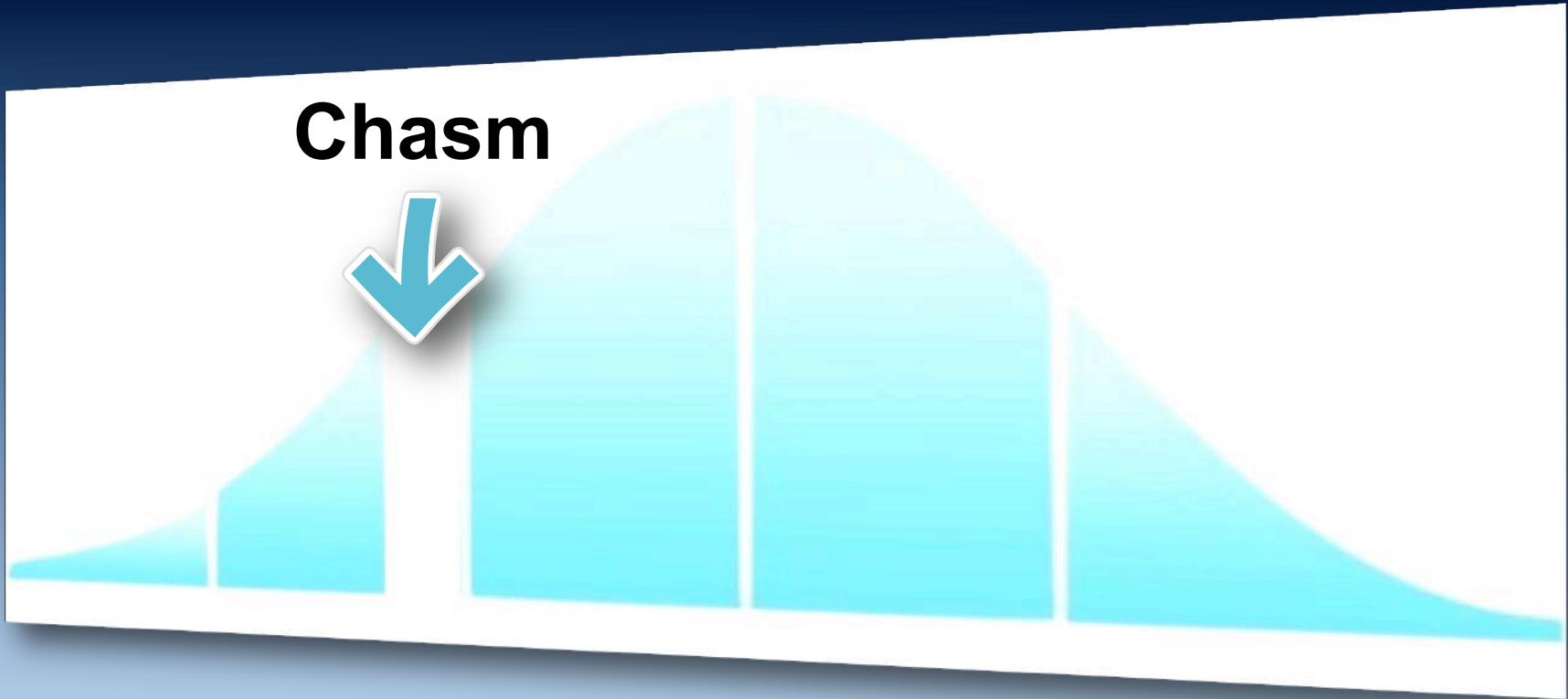
# Innovation adoption lifecycle



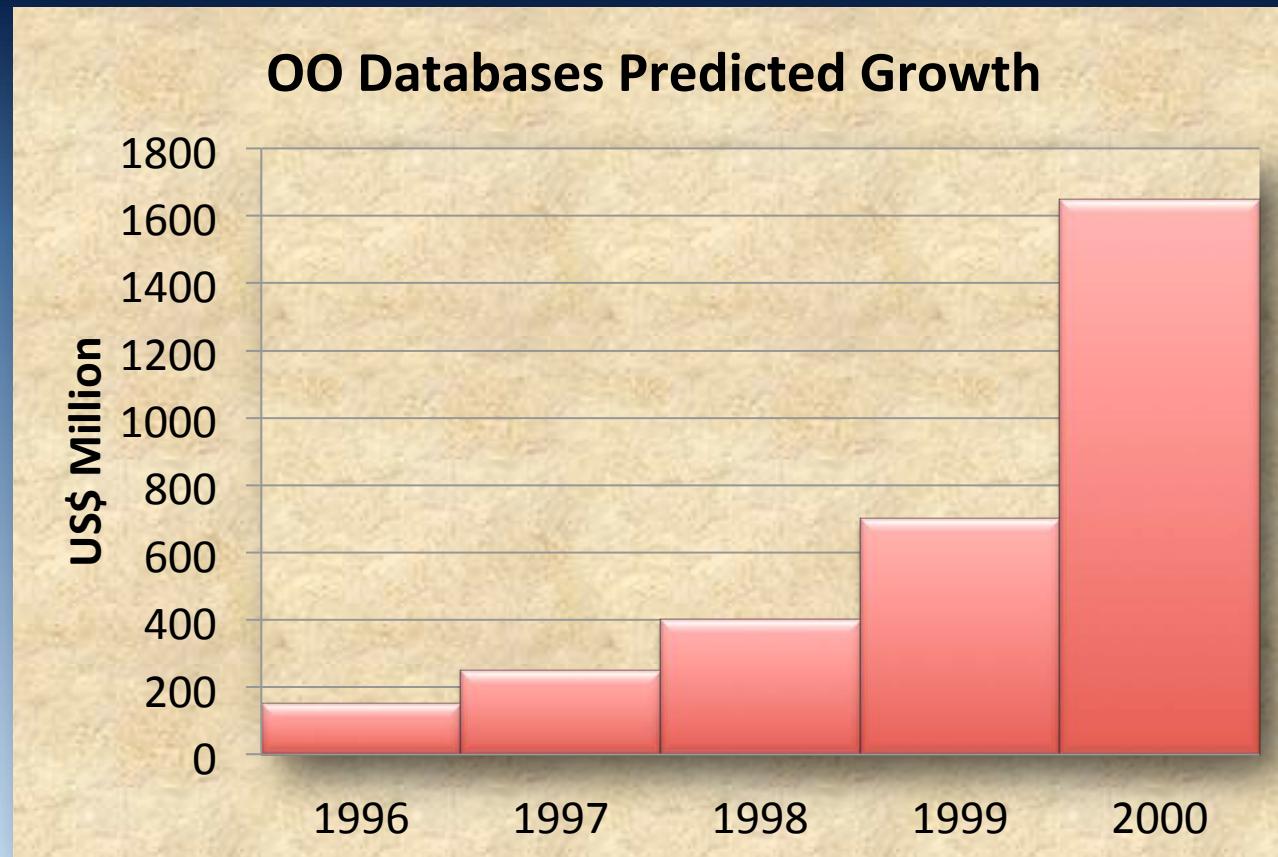
**INNOVATION ADOPTION LIFECYCLE**

Source: [http://en.wikipedia.org/wiki/Technology\\_adoption\\_lifecycle](http://en.wikipedia.org/wiki/Technology_adoption_lifecycle)

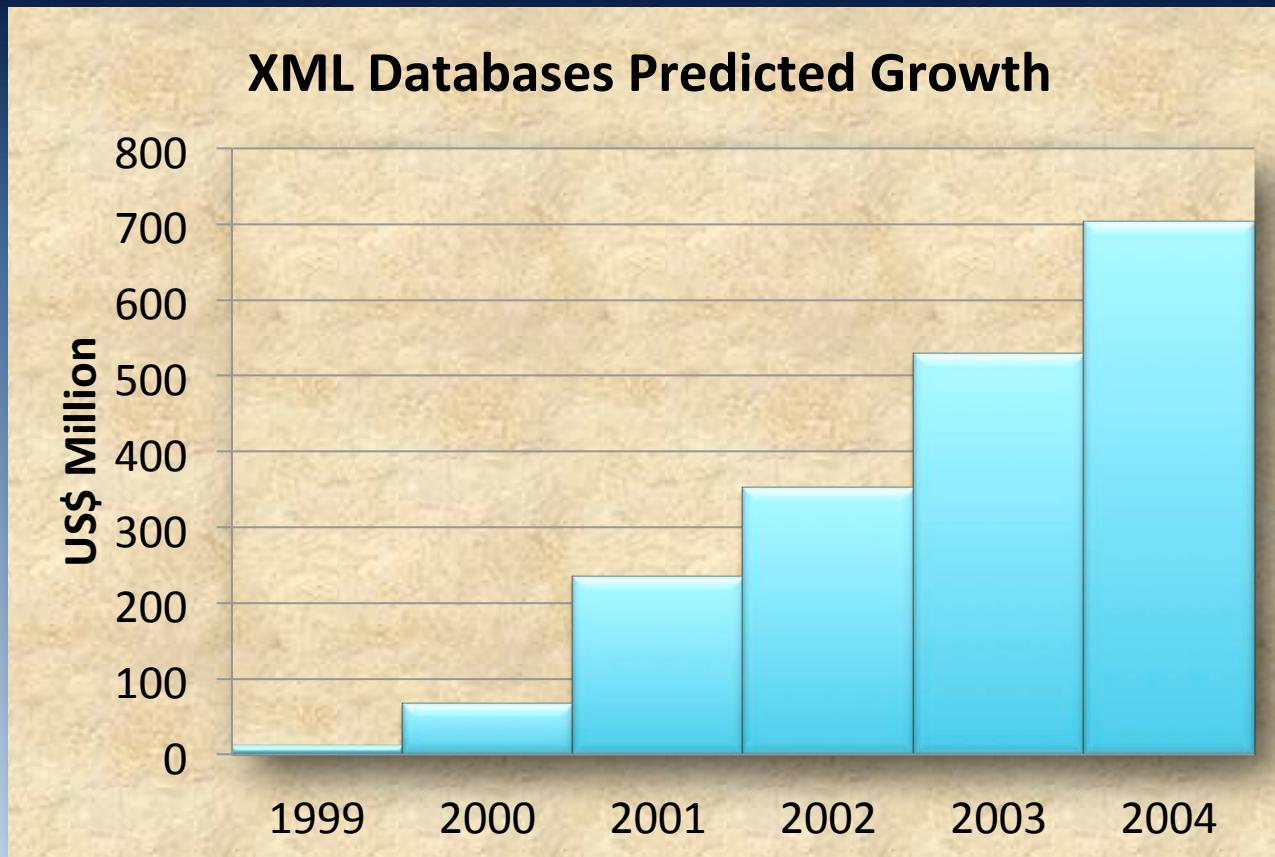
# Crossing the chasm



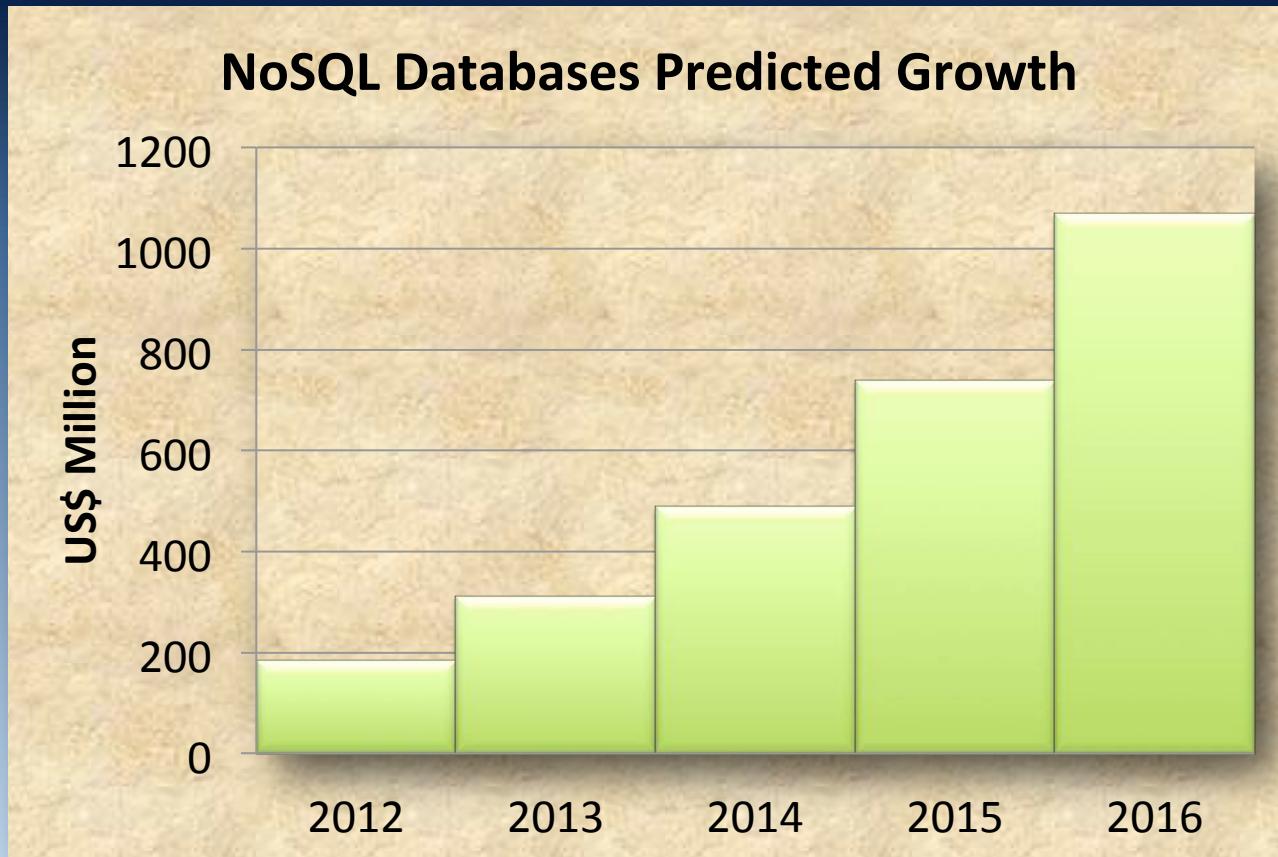
# 1990s



# 2000s



# Today



# The way developers really think



# OO vs. Relational



**Source:** Inspired by comments from Esther Dyson during the 1990s

# XML vs. Relational



Source: Inspired by “Tamino - What is it good for?” Curtis Pew (2003)

# NoSQL vs. Relational

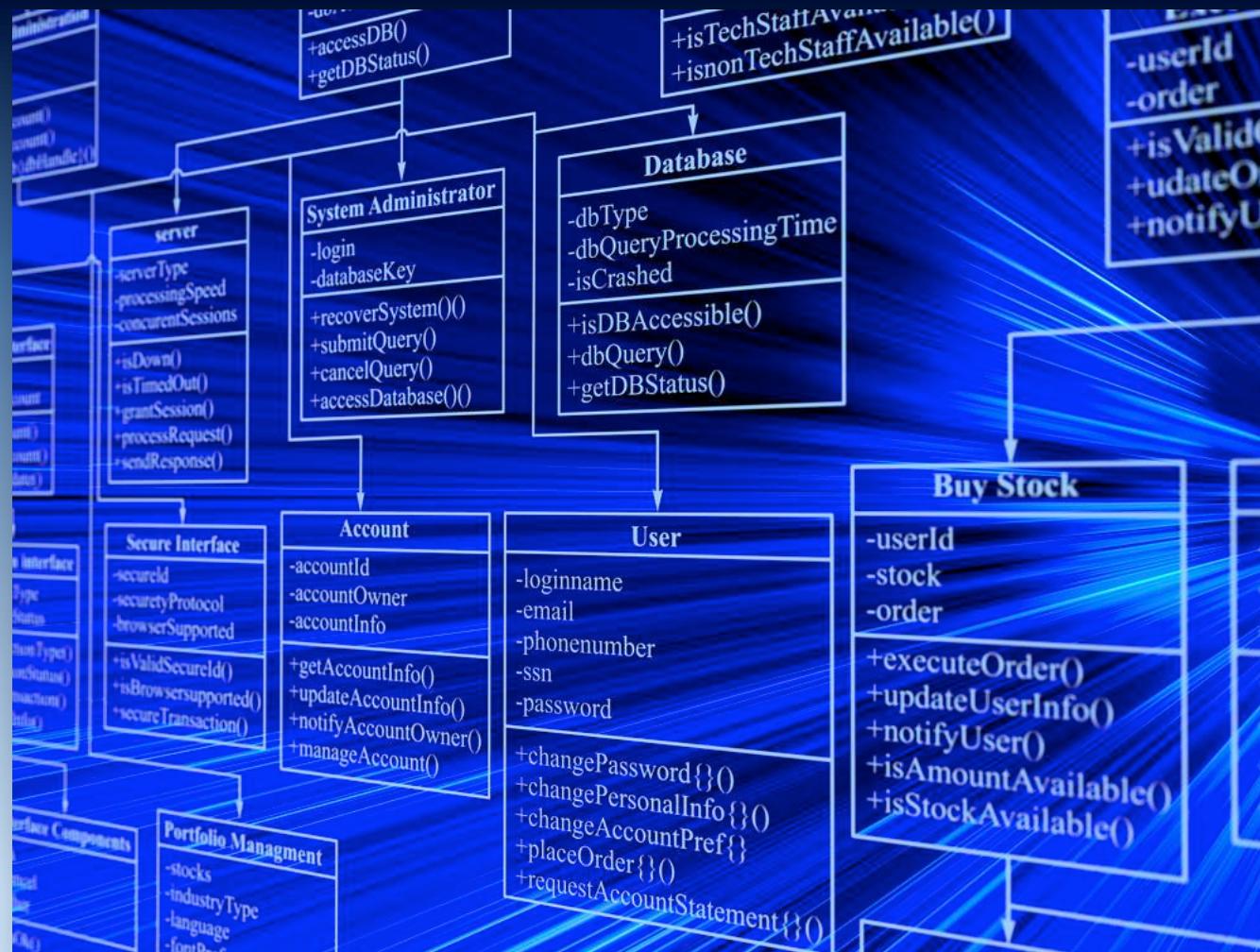


Source: Inspired by “Data Management for Interactive Applications” Couchbase (12 June 2013) and “MongoDB and the OpEx Business Plan” MongoDB (9 July 2013)

# But ...

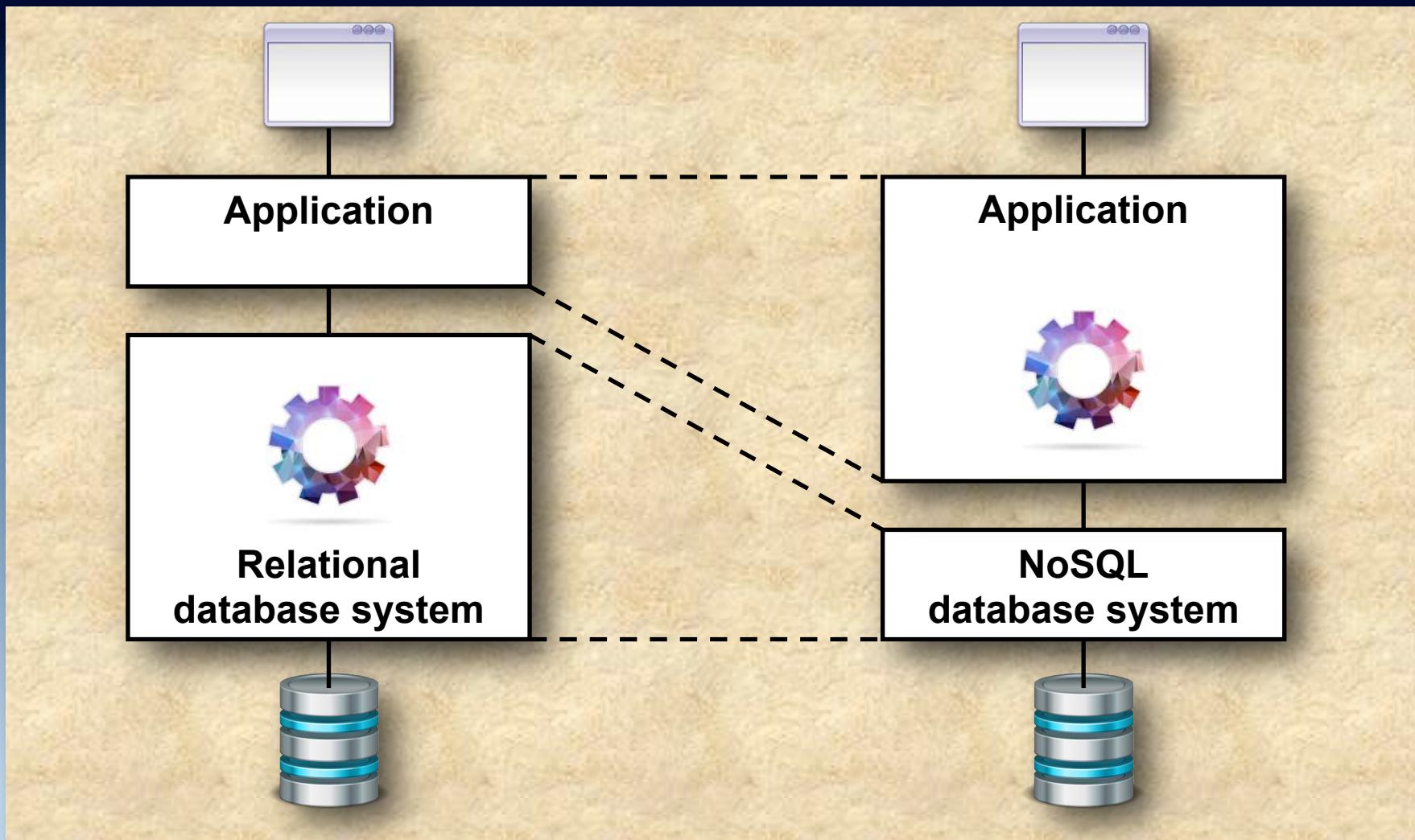


# Relational flexibility



Source: Shutterstock Image ID 73381360

# Welcome to 1985 ...



Source: After “NoSQL and the responsibility shift” Denshade (14 March 2015)

# Welcome to 1985



*NoSQL-only solutions also only store data. They don't process it. Data must be brought to the application for analysis. The application (and hence each individual application developer) is responsible for efficiently accessing data, implementing business rules, and for data consistency.*

-- Pierre Fricke

# “MongoDB is web scale”



*It may surprise you that there are a handful of high-profile websites still using relational databases and in particular MySQL.*



# NoSQL is developer-friendly

## Other Stakeholders



**Developers**

# But ...



*Riak ... We're talking about nearly a year of learning.<sup>[1]</sup>*

*Things I wish I knew about MongoDB a year ago<sup>[2]</sup>*

*I am learning Cassandra. It is not easy.<sup>[3]</sup>*

[1] <http://productionscale.com/blog/2011/11/20/building-an-application-upon-riak-part-1.html>

[2] <http://snmaynard.com/2012/10/17/things-i-wish-i-knew-about-mongodb-a-year-ago/>

[3] <http://planetcassandra.org/blog/post/datastax-java-driver-for-apache-cassandra>

# And ...



*... it takes 1-3 years to get an enterprise application onto a new data platform like Cassandra ... Cassandra requires a complete re-thinking of the data model which many find challenging.*

-- Shanti Subramanyam

# And ...

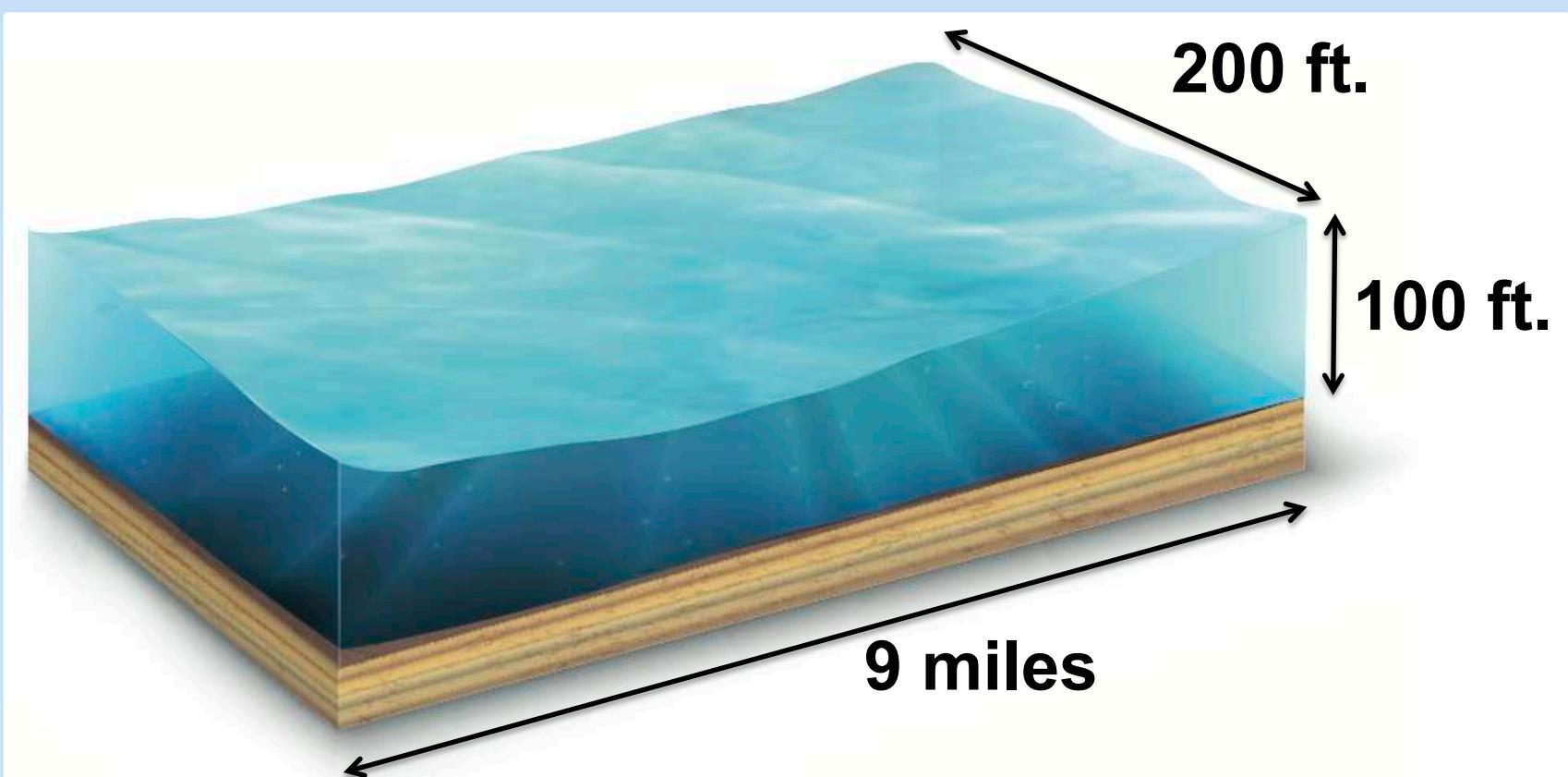


*Going from being a company where most people spent their entire careers using relational databases ... to NoSQL structure, we then ended up creating problems for ourselves ... So with hindsight I would have thought more about the organisational preparedness.*

-- Keith Pritchard

Source: "JPMorgan consolidates derivative trade systems with NoSQL database" Matthew Finnegan (12 March 2015)

# Moving corporate data ...



Source: Shutterstock Image ID 163030709

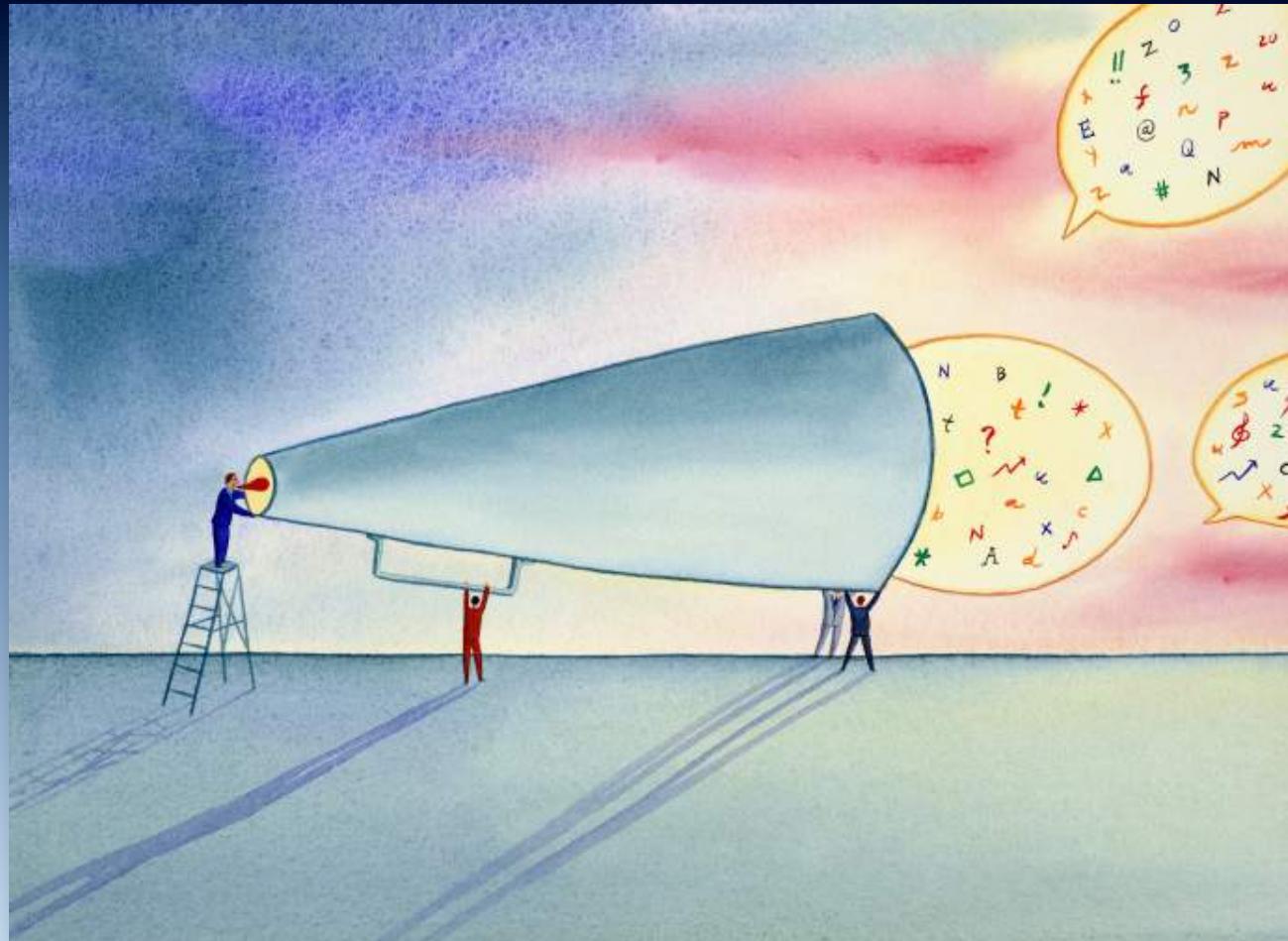
# Moving corporate data

- Moving water from one big tank to another without losing a single drop
  - Reading from Relational and writing to NoSQL
- The amount of information currently stored in NoSQL databases would not quench a thirst on a hot day
- Dante has reserved a special place in hell for NoSQL database vendors
  - Moving water from one big tank into another using just a small spoon between their teeth

# But ...

- Riak at the National Health Service (UK)
  - New DBMS needs 10-12 people to manage it, compared to over 100 for the old systems
  - Cost of infrastructure supporting new DBMS reduced to ~5% of the old systems
  - Lookup times for patient records significantly reduced from seconds to milliseconds

# NoSQL hoopla and hype



Source: Getty Image ID WCO\_030



Source: Shutterstock Image ID 92042489



Source: Inspired by “The Next Big Thing 2012” The Wall Street Journal (27 September 2012)



Source: Inspired by “NoSQL takes the database market by storm” Brandon Butler (27 October 2014)



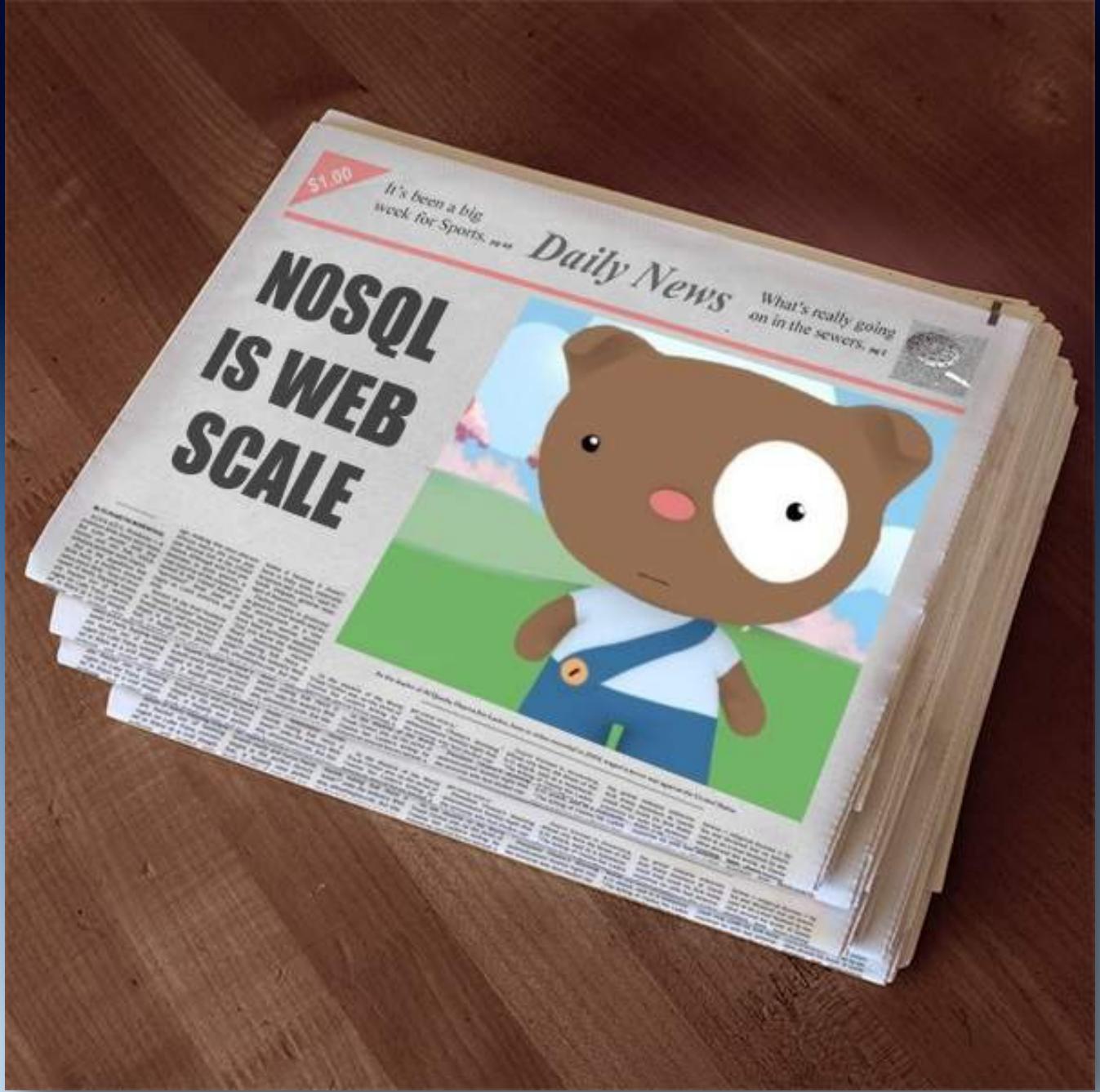
Source: Inspired by <http://www.marketresearchmedia.com/?p=568> and <http://www.pr.com/press-release/613495>







Source: Inspired by <http://dilbert.com/strip/1995-01-22/>





Source: Inspired by <http://vimeo.com/104045795/>



Source: Inspired by <https://www.youtube.com/watch?v=3MNlrKIQp2E>









Source: Inspired by “MongoDB: Second Round” Thomas Jaspers (8 November 2012)



Source: Inspired by “Why MongoDB is Awesome” John Nunemaker (15 May 2010) and “Why Neo4J is awesome in 5 slides” Florent Biville (29 October 2012)





Source: Inspired by <http://slv.io/>





Source: Inspired by “Saturday Night Live” Season 1 Episode 9 (1976)



Source: Inspired by the movie “Airplane!” (1980)

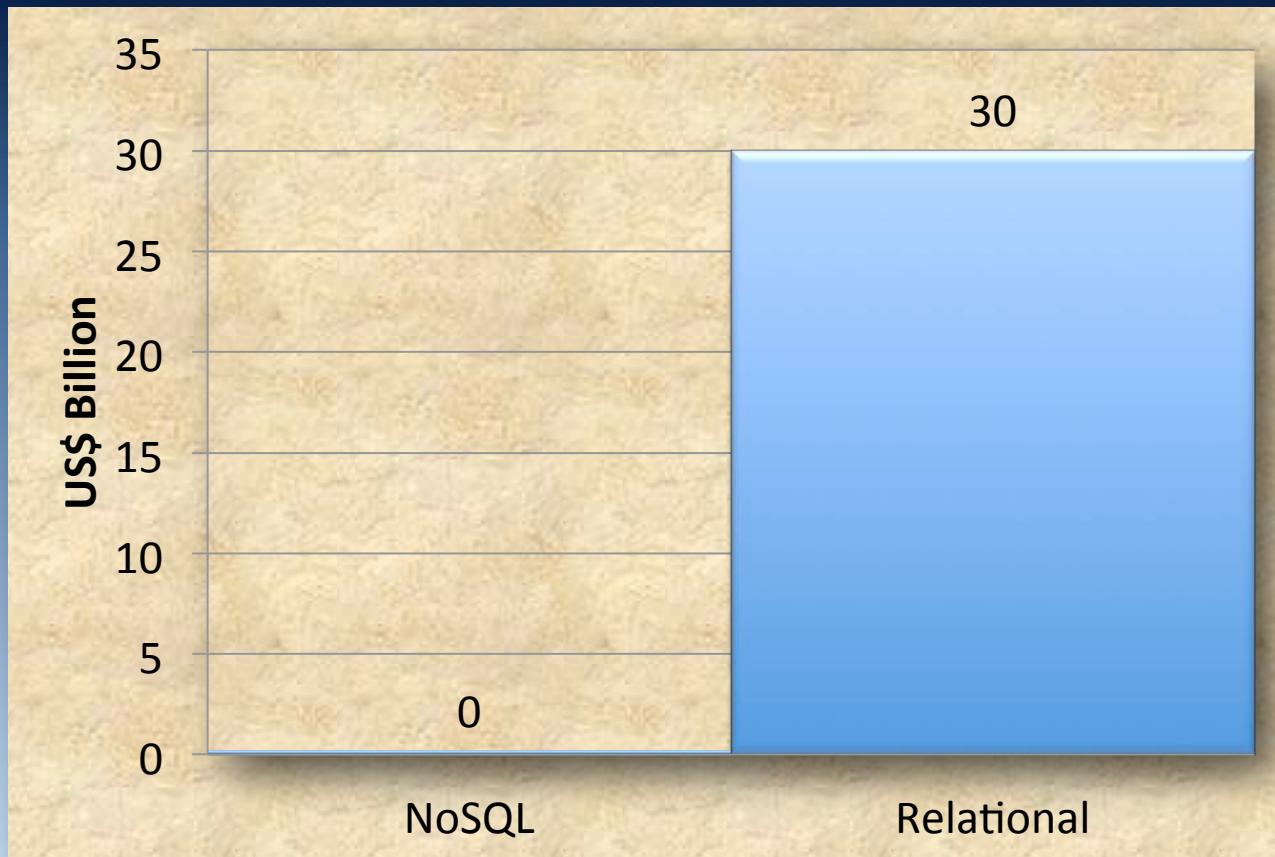
# Past proclamations of the imminent demise of relational technology

- Object databases vs. relational
  - GemStone, ObjectStore, Objectivity, etc.
- In-memory databases vs. relational
  - SolidDB, TimesTen, etc.
- Persistence frameworks vs. relational
  - Hibernate, OpenJPA, etc.
- XML databases vs. relational
  - BaseX, Tamino, etc.
- Column-store databases vs. relational
  - Sybase IQ, Vertica, etc.

# Market analysis



# Database market size ...



Source: "2014 State of Database Technology" InformationWeek (March 2014)

# Database market size



*NoSQL is a small but growing segment of the database market, according to 451 Research's Matt Aslett, who predicts it at about 2% of the size of the SQL market.*

-- Brandon Butler

# NoSQL market size

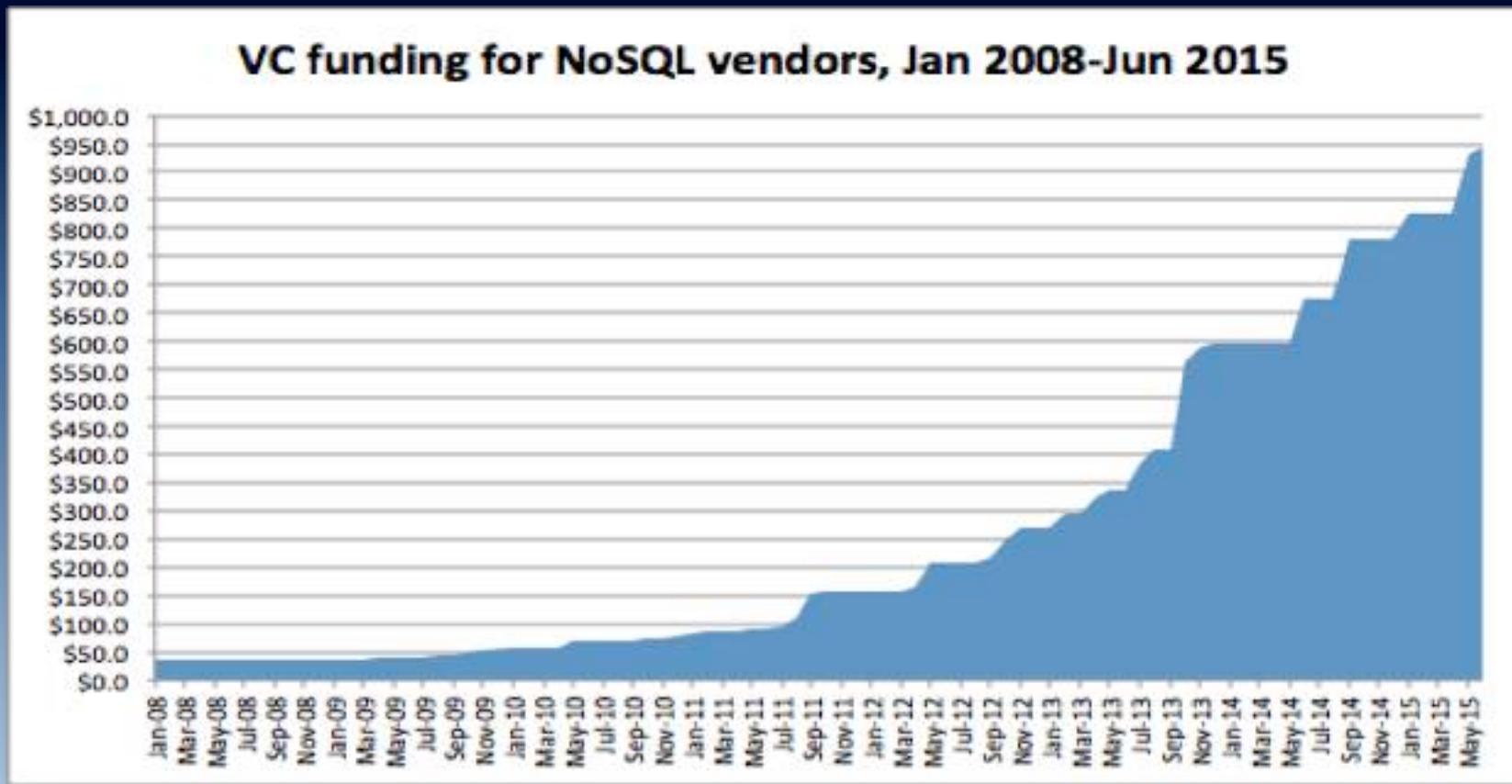
- Private companies do not publish results
- Venture Capital (VC) funding 10s/100s of millions of US \$
- NoSQL revenue
  - \$20 million in 2011<sup>[1]</sup>
  - \$184 million in 2012<sup>[2]</sup>
  - \$223 million in 2014<sup>[3]</sup>



[1] [http://blogs.the451group.com/information\\_management/2012/05/](http://blogs.the451group.com/information_management/2012/05/)

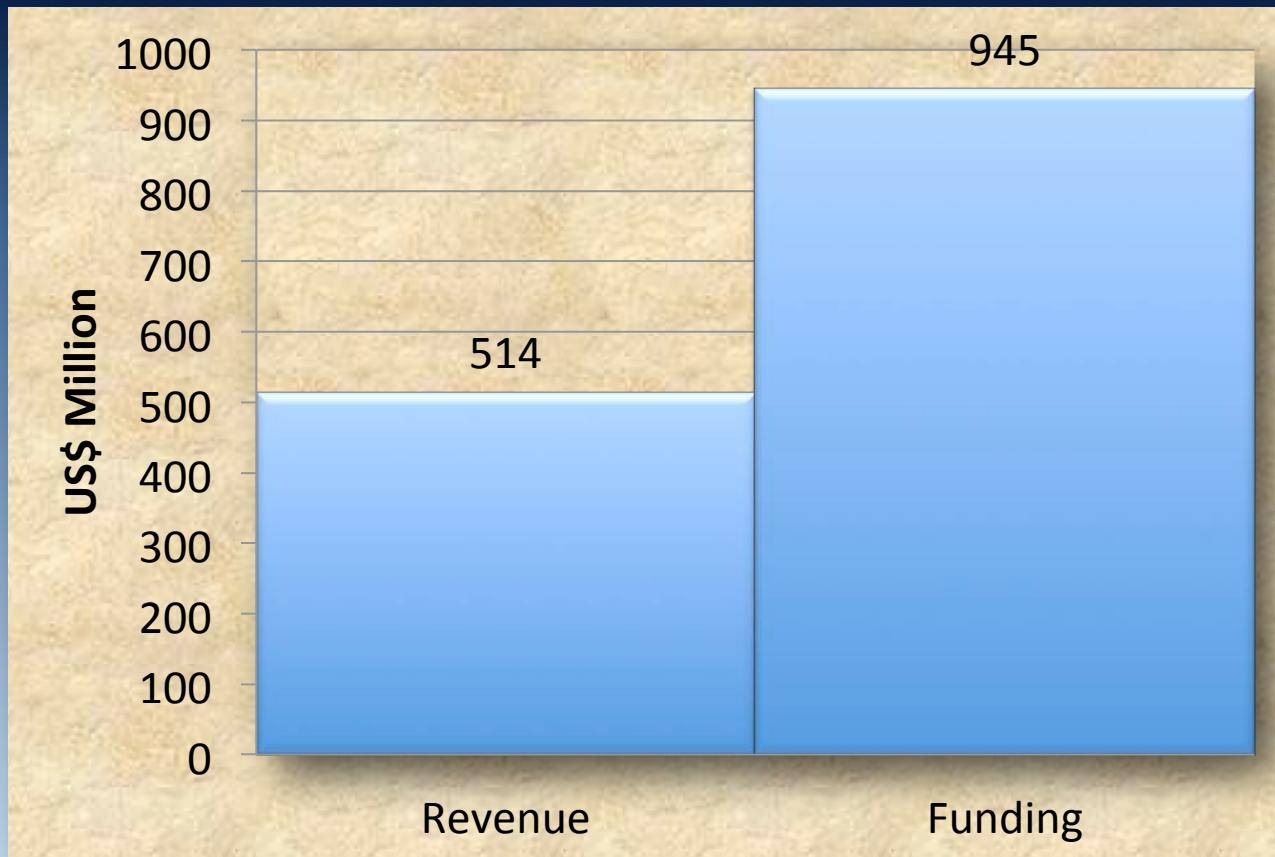
[2] <http://www.cio.co.uk/insight/data-management/new-database-dawn/>

[3] <http://www.datanami.com/2015/04/02/booming-big-data-market-headed-for-60b/>



Source: "NoSQL by the numbers" Matt Aslett (23 July 2015)

# 2014 revenue vs. funding



Source: "NoSQL by the numbers" Matt Aslett (23 July 2015)

# Investment in NoSQL, NewSQL

| Company      | \$ (Million) |
|--------------|--------------|
| MongoDB      | 231          |
| Couchbase    | 116          |
| DataStax     | 83.7         |
| Clustrix     | 59.3         |
| Basho        | 32.5         |
| FoundationDB | 22.3         |
| Aerospike    | 22           |

Source: “The NoSQLNow conference in San Jose this week” Jnan Dash (22 August 2014)

# Recent investment in NoSQL

| Company    | \$ (Million)         |
|------------|----------------------|
| MongoDB    | 311 <sup>[1]</sup>   |
| DataStax   | 189.7 <sup>[1]</sup> |
| MarkLogic  | 173 <sup>[2]</sup>   |
| Couchbase  | 116                  |
| Basho      | 64 <sup>[3]</sup>    |
| Neo4j      | 44.1 <sup>[4]</sup>  |
| Redis Labs | 28 <sup>[5]</sup>    |

[1] <http://venturebeat.com/2015/01/12/basho-funding/>

[2] <http://fortune.com/2015/05/12/marklogic-snags-102-million/>

[3] <http://www.idgconnect.com/abstract/9332/basho-enterprise-focus-winning-friends-funds/>

[4] <http://fortune.com/2015/02/03/datastax-acquisition-database-software/>

[5] <http://www.informationweek.com/big-data/big-data-analytics/redis-emerges-as-nosql-in-memory-performer-/d/d-id/1321047>

# Vendor revenue example ...



*The new funding, which values MongoDB at \$1.6 billion ... Wikibon estimates MongoDB's 2014 revenue at \$46 million, meaning the company is valued at approximately 35-times lagging 12-month revenue ...*

-- Jeff Kelly

# Vendor revenue example



*MongoDB ... I would say if we could get to 20 to 25 per cent of our user base then we would have a multi-billion dollar company; [at the moment] it's less than five per cent*

-- Dev Ittycheria

Source: “Scaling up at MongoDB: How CEO Dev Ittycheria wants to make a fifth of the NoSQL database’s users paid-for” Sooraj Shah (15 June 2015)

# Vendor profitability example



*MongoDB ... Profitability is still at least a couple years away, Chairman and Co-founder Dwight Merriman told me in an interview.*

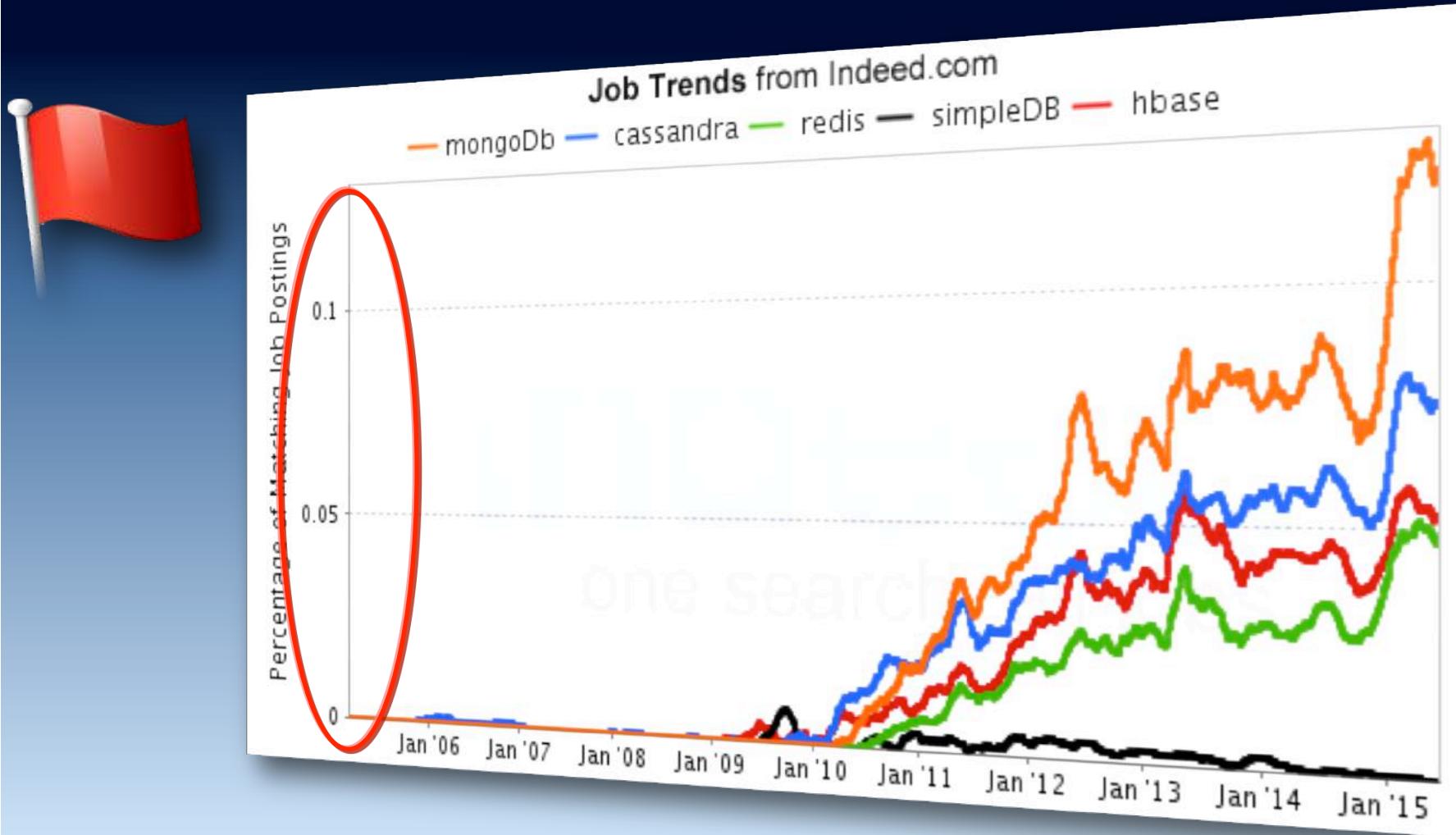
-- Ben Fischer

# Number of customers

| Company      | Customers   |
|--------------|-------------|
| MongoDB      | 2500        |
| DataStax     | 500         |
| MarkLogic    | 500         |
| Couchbase    | 450         |
| Basho        | 200         |
| Neo4j        | 150         |
| <b>Total</b> | <b>4300</b> |

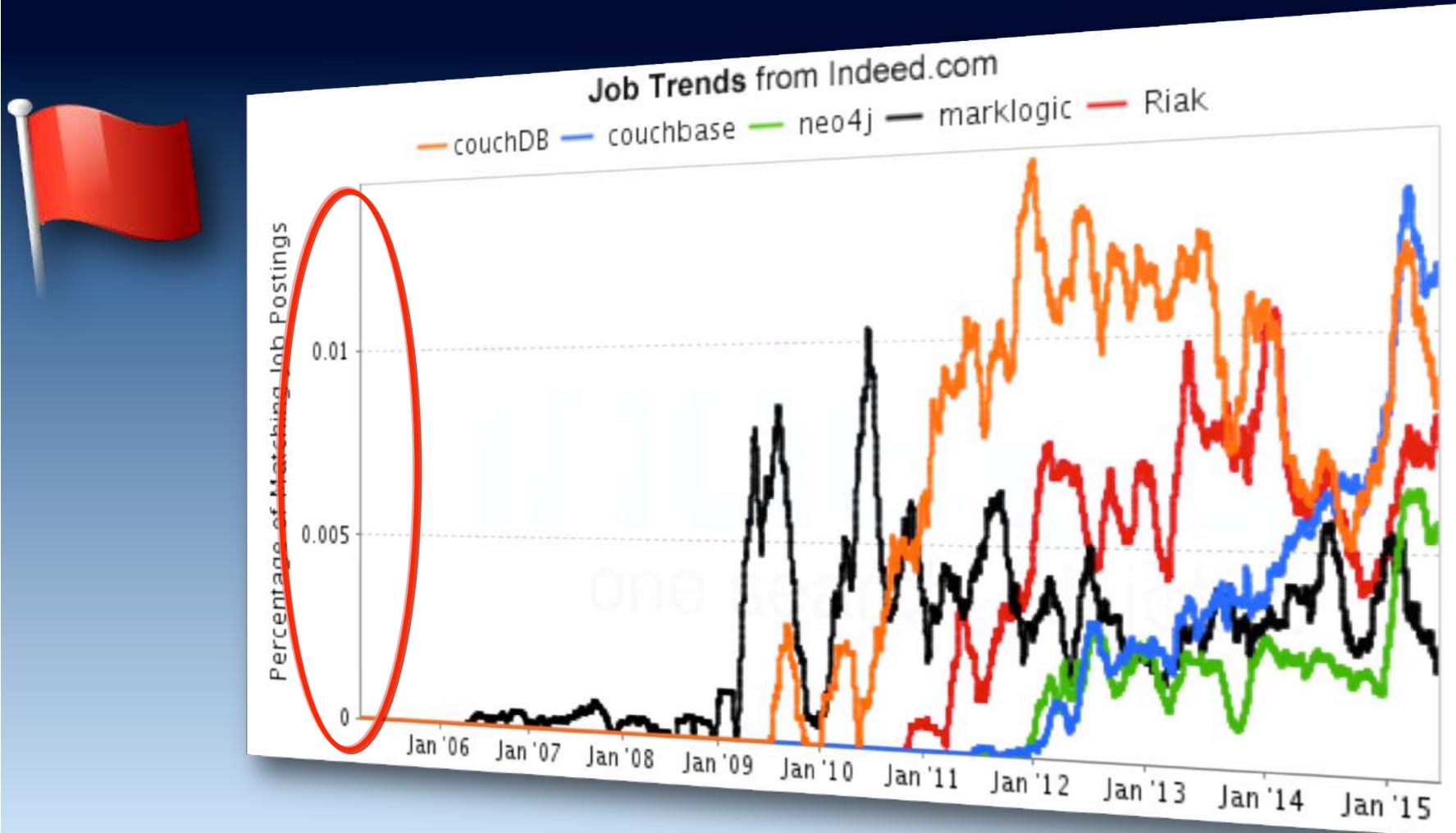
Source: “NoSQL by the numbers” Matt Aslett (23 July 2015)

# NoSQL job trends ...



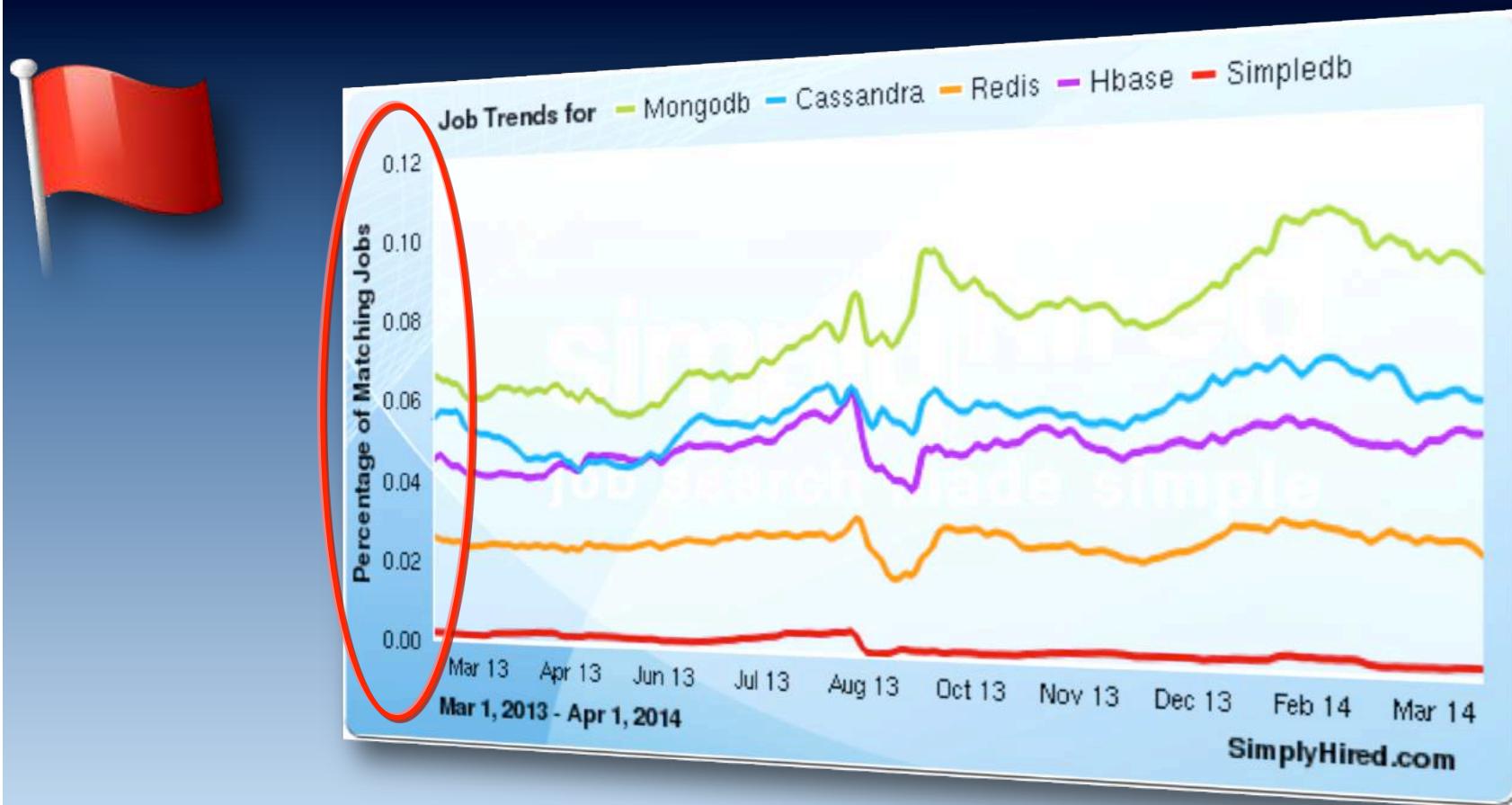
Source: After “NoSQL Job Trends: August 2014” Robert Diana (4 September 2014)

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Source: "NoSQL Job Trends: August 2014" Robert Diana (4 September 2014)

# NoSQL job trends



Source: "NoSQL Job Trends: August 2014" Robert Diana (4 September 2014)

# Most valuable IT skills in 2012

| Skill              | \$             |
|--------------------|----------------|
| 1. Hadoop          | 115,062        |
| 2. Big Data        | 113,739        |
| <b>3. NoSQL</b>    | <b>113,031</b> |
| 4. PMBook          | 110,885        |
| 5. Omnigraffle     | 110,758        |
| 6. SOA             | 109,504        |
| <b>7. Mongo DB</b> | <b>108,304</b> |
| 8. Jetty           | 106,936        |
| 9. Objective C     | 104,989        |
| 10. ETL            | 104,777        |

Source: “Dice Tech Salary Survey” Dice (22 January 2013)

# Most valuable IT skills in 2013

| Skill               | \$             |
|---------------------|----------------|
| 1. R                | 115,531        |
| <b>2. NoSQL</b>     | <b>114,796</b> |
| 3. MapReduce        | 114,396        |
| 4. PMBook           | 112,382        |
| <b>5. Cassandra</b> | <b>112,382</b> |
| 6. Omnigraffle      | 111,039        |
| 7. Pig              | 109,561        |
| 8. SOA              | 108,997        |
| 9. Hadoop           | 108,669        |
| <b>10. Mongo DB</b> | <b>107,825</b> |

Source: "Dice Tech Salary Survey" Dice (29 January 2014)

# Most valuable IT skills in 2014

| Skill               | \$             |
|---------------------|----------------|
| 1. PaaS             | 130,081        |
| <b>2. Cassandra</b> | <b>128,646</b> |
| 3. MapReduce        | 127,315        |
| 4. Cloudera         | 126,816        |
| <b>5. HBase</b>     | <b>126,369</b> |
| 6. Pig              | 124,563        |
| 7. ABAP             | 124,262        |
| 8. Chef             | 123,458        |
| 9. Flume            | 123,186        |
| 10. Hadoop          | 121,313        |

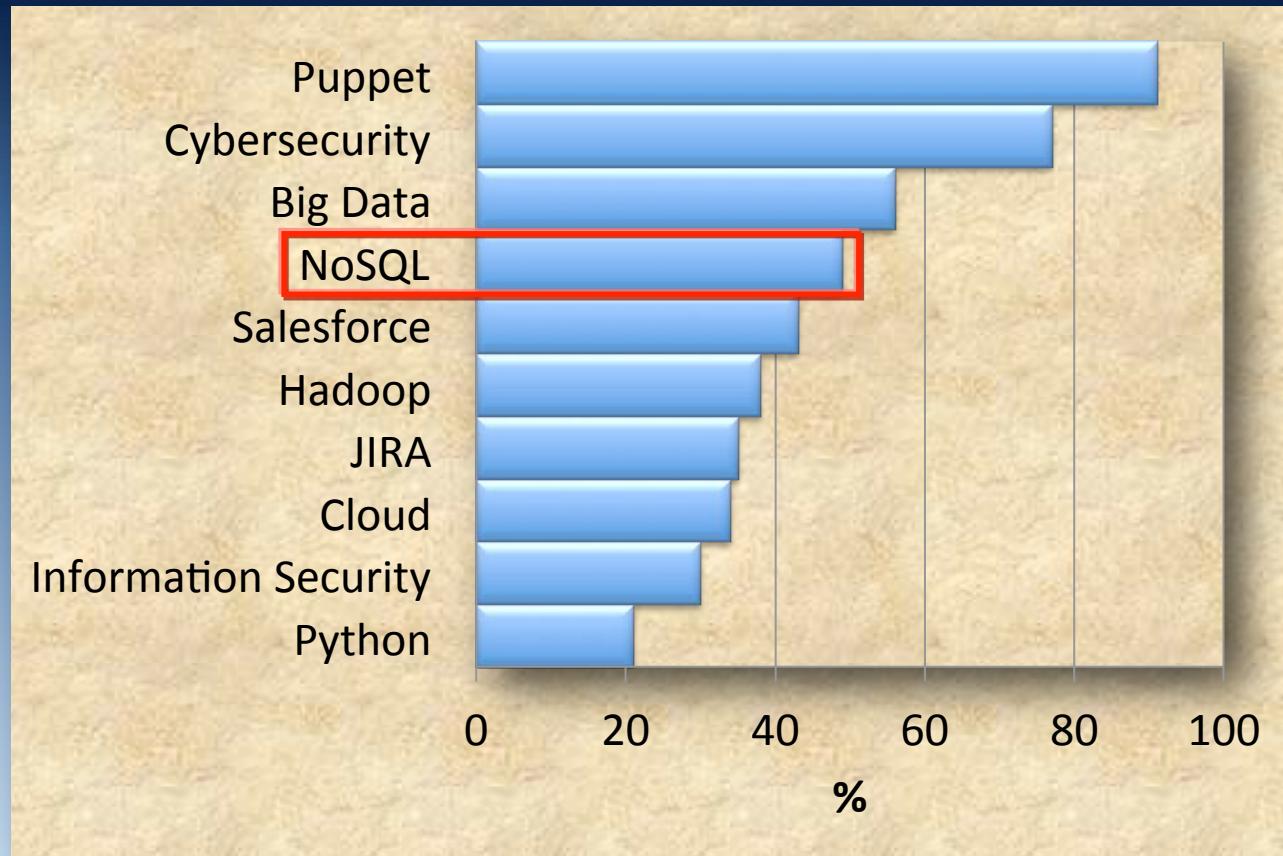
Source: “Dice Tech Salary Survey” Dice (22 January 2015)

# Most valuable IT skills in 2015

| Skill               | \$             |
|---------------------|----------------|
| 1. HANA             | 154,749        |
| <b>2. Cassandra</b> | <b>147,811</b> |
| 3. Cloudera         | 142,835        |
| 4. PaaS             | 140,894        |
| 5. OpenStack        | 138,579        |
| 6. CloudStack       | 138,095        |
| 7. Chef             | 136,850        |
| 8. Pig              | 132,850        |
| 9. MapReduce        | 131,563        |
| 10. Puppet          | 131,121        |

Source: “Dice Tech Salary Survey” Dice (26 January 2016)

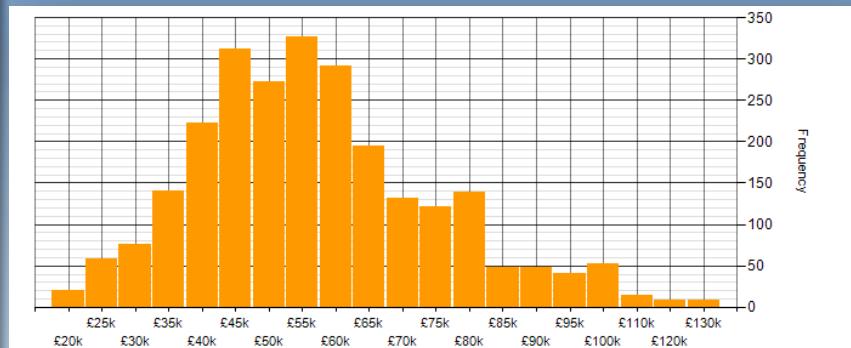
# Fastest growing tech skills



Source: "The Fastest-Growing Tech Skills: Dice Report" Shravan Goli (15 September 2014)

# NoSQL jobs in the UK (perm)

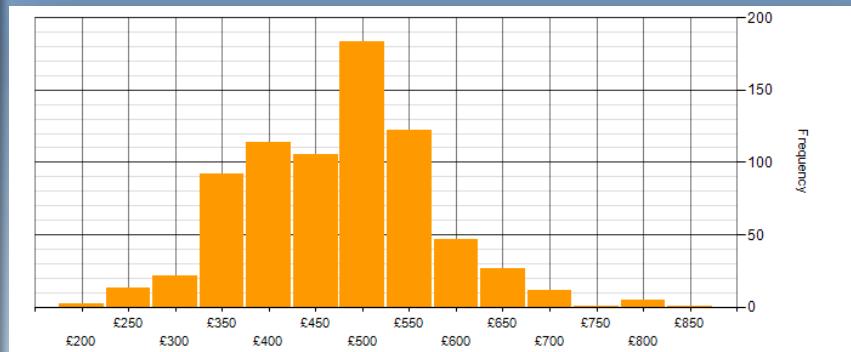
- Database and Business Intelligence
  - MongoDB (1892)
  - Cassandra (871)
  - Redis (338)
  - Neo4j (183)
  - CouchDB (181)
  - Couchbase (174)
  - HBase (158)
  - Riak (144)



Source: <http://www.itjobswatch.co.uk/jobs/uk/nosql.do> (30 January 2016)

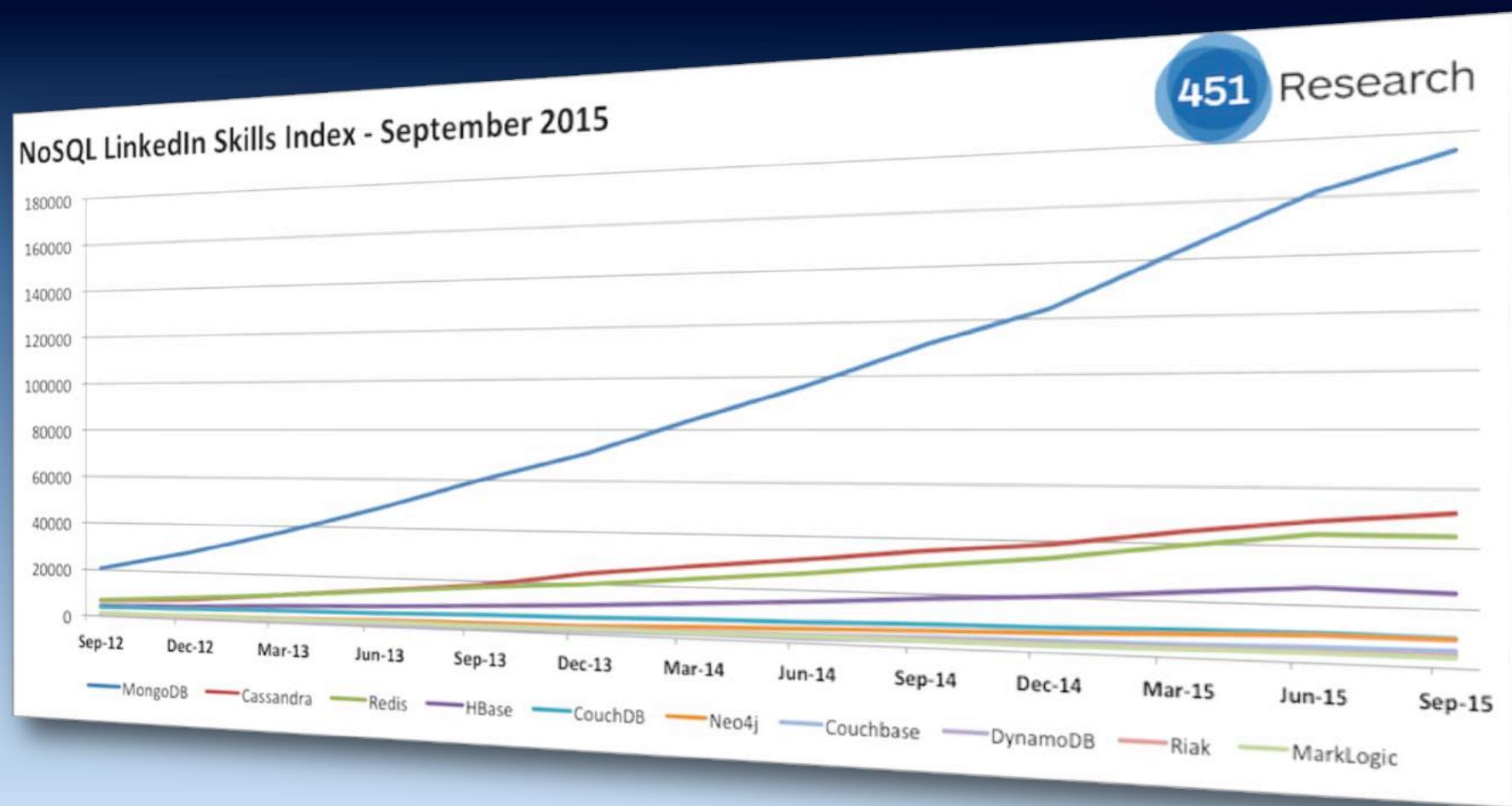
# NoSQL jobs in the UK (contract)

- Database and Business Intelligence
  - MongoDB (746)
  - Cassandra (392)
  - Redis (133)
  - HBase (65)
  - CouchDB (55)
  - DynamoDB (52)
  - Couchbase (43)
  - Neo4j (31)



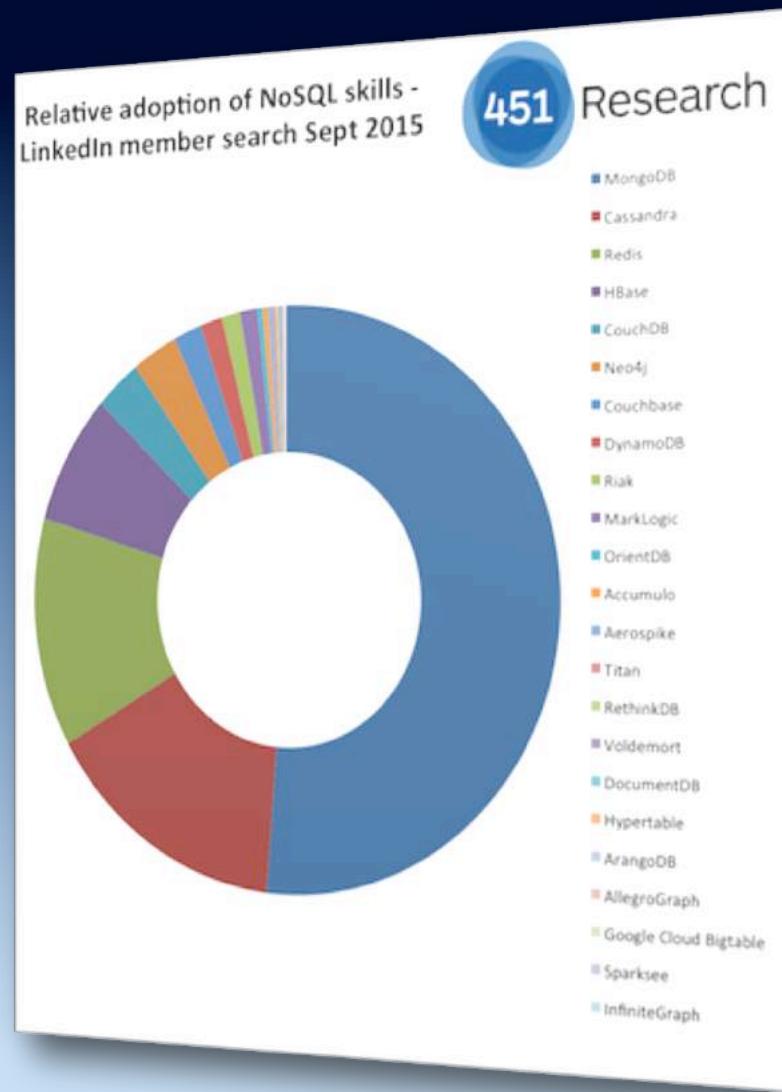
Source: <http://www.itjobswatch.co.uk/contracts/uk/nosql.do> (30 January 2016)

# NoSQL LinkedIn skills index ...



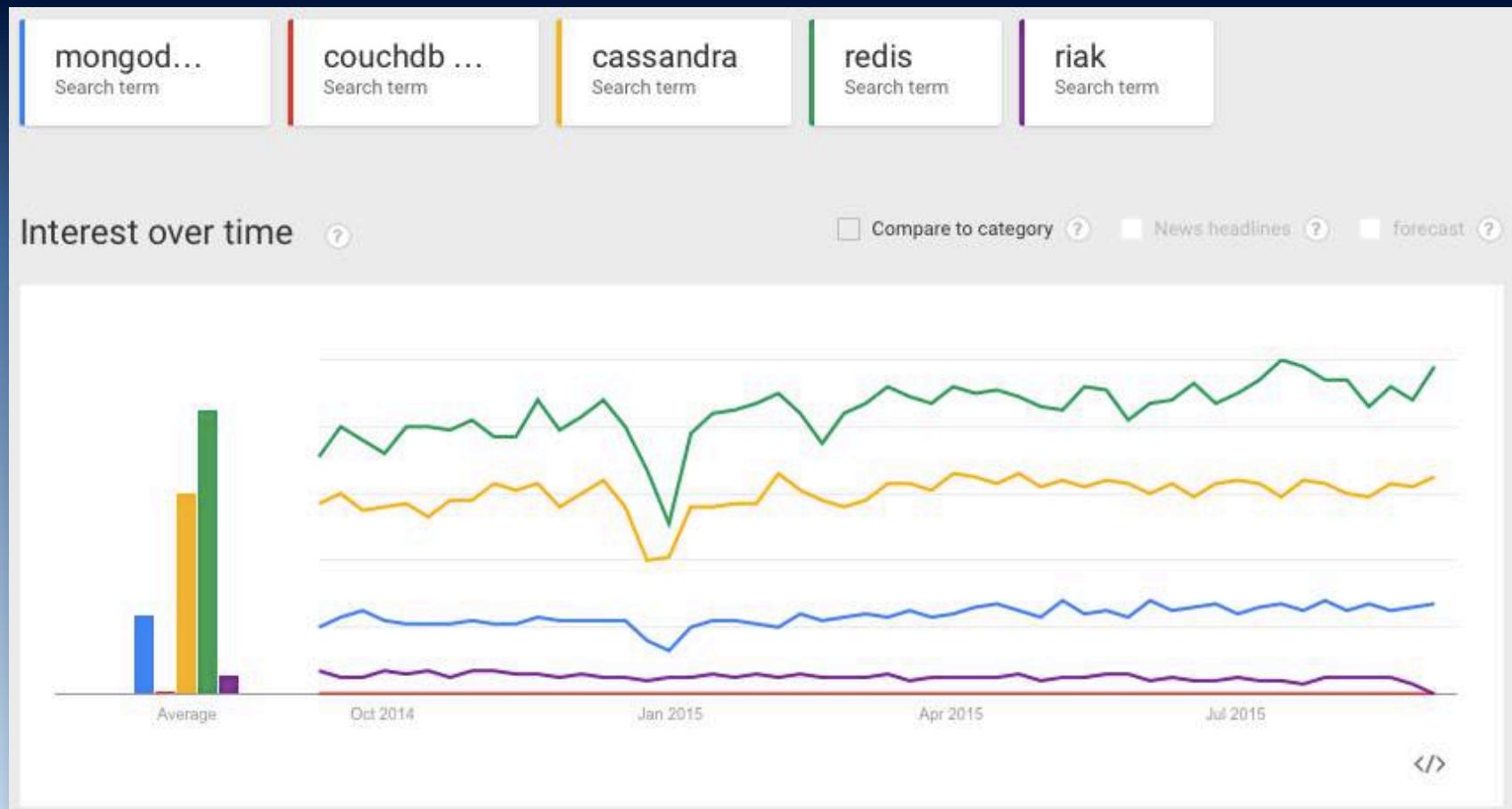
Source: "NoSQL LinkedIn Skills Index - September 2015" Matthew Aslett (1 October 2015)

# NoSQL LinkedIn skills index



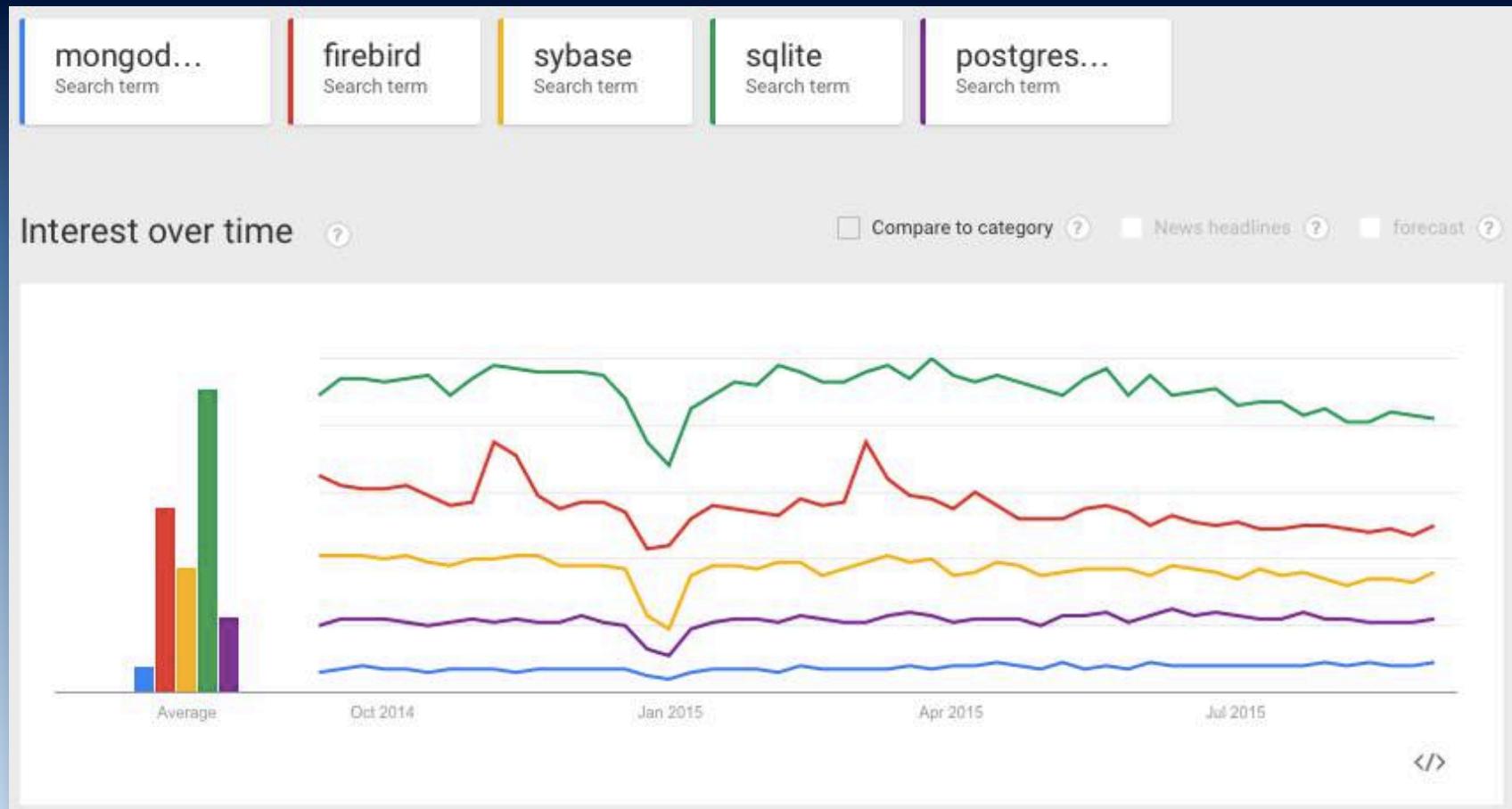
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# NoSQL vs. the world ...



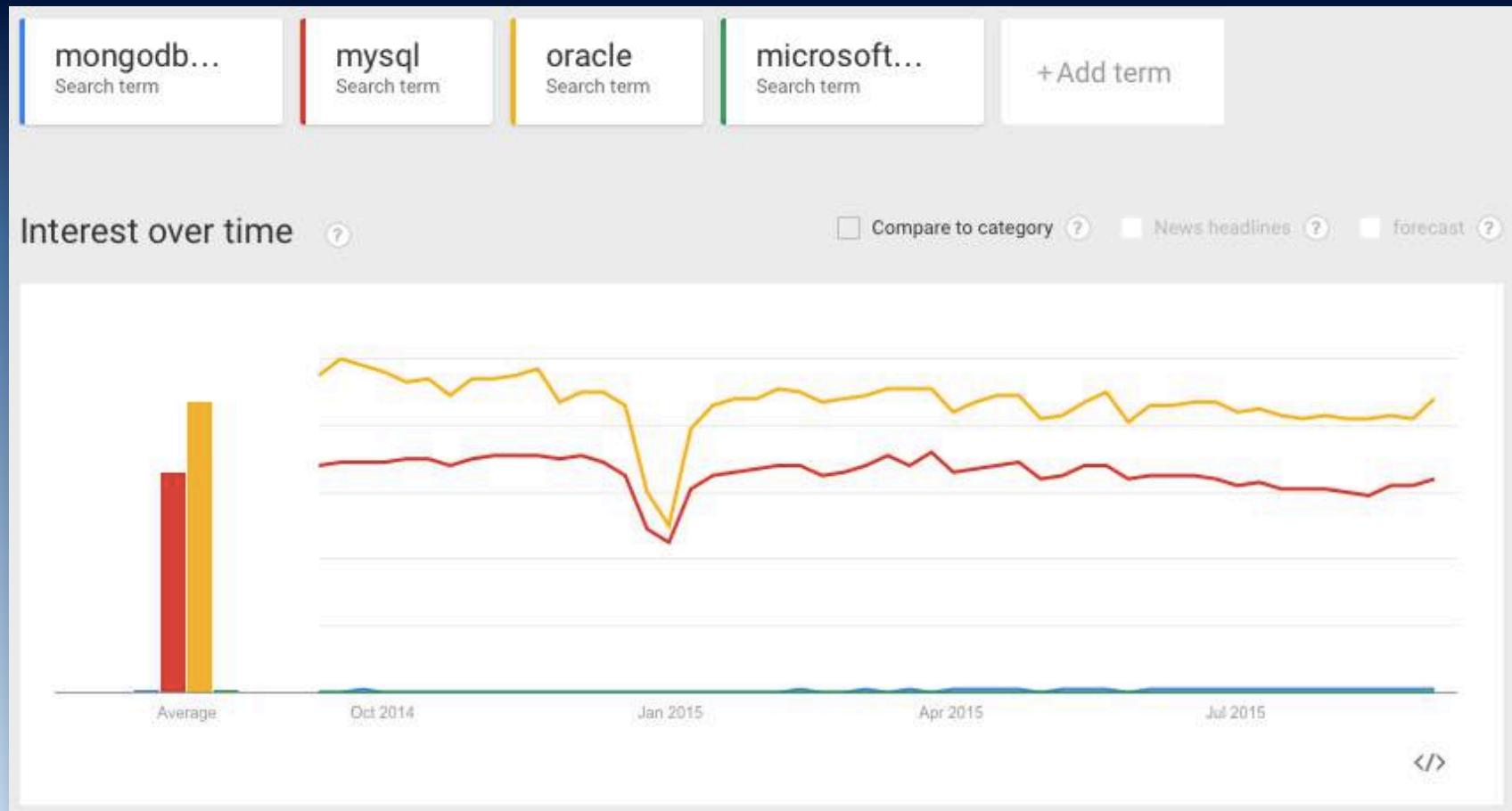
Source: After “NoSQL vs. the world” Kristina Chodorow (5 May 2011)

# NoSQL vs. the world ...



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# NoSQL vs. the world



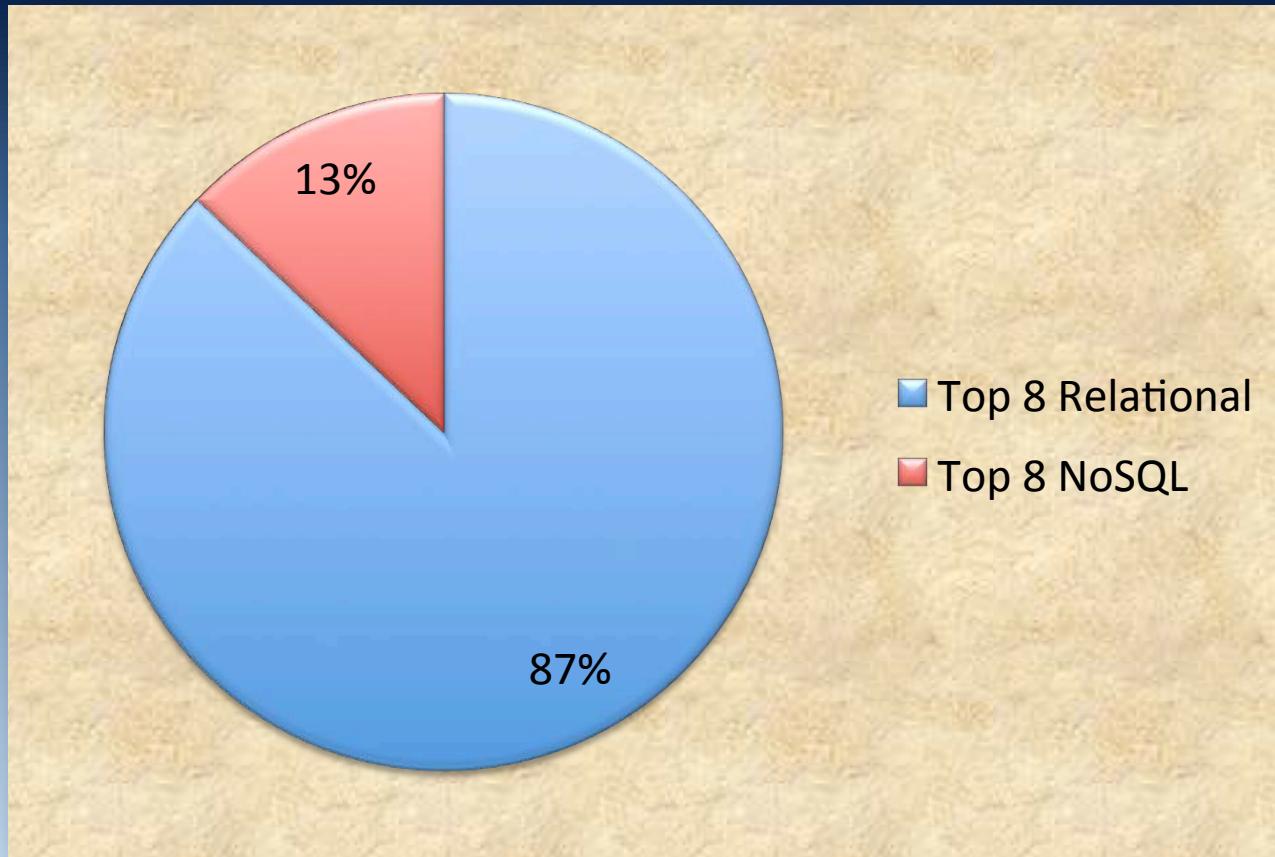
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# DB-Engines ranking ...



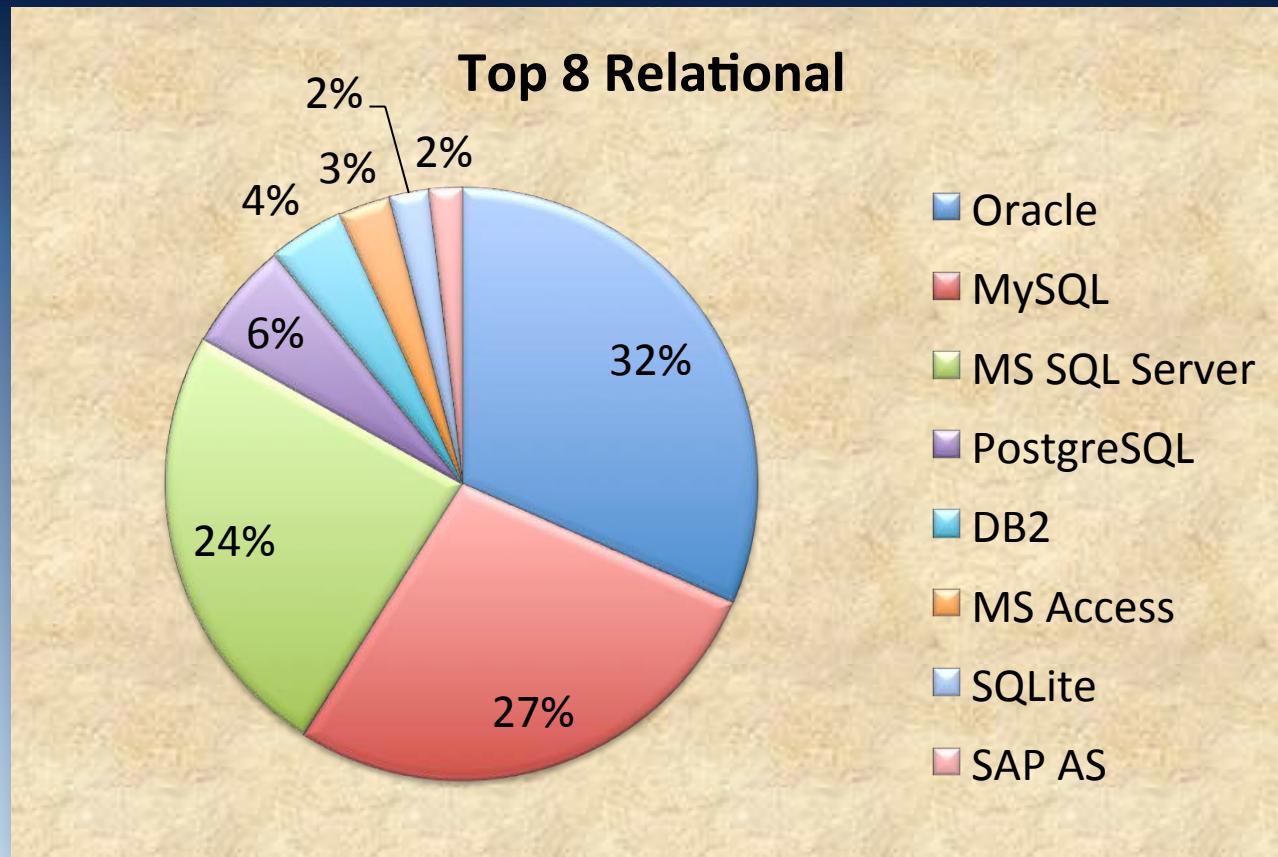
Source: [http://db-engines.com/en/ranking\\_trend/](http://db-engines.com/en/ranking_trend/) (4 September 2015)

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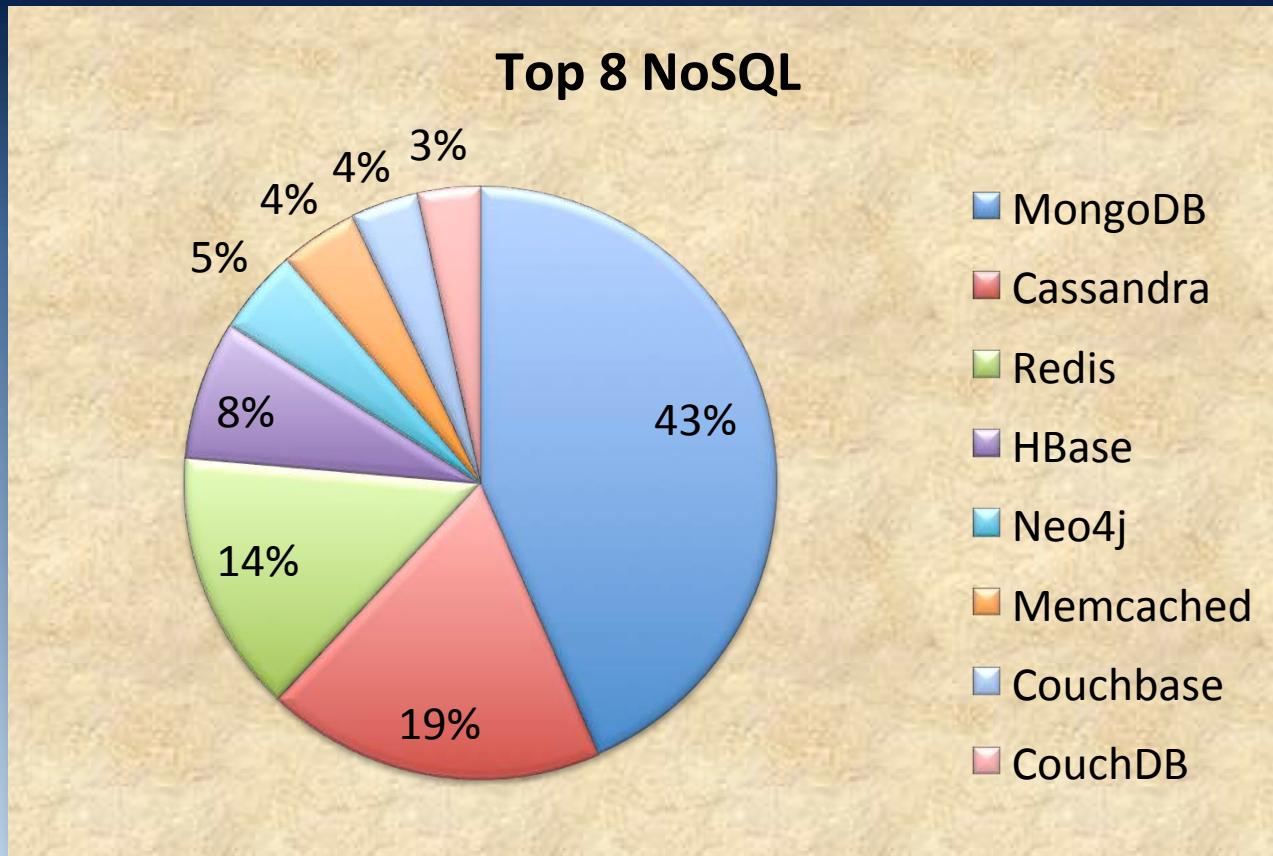
Source: <http://db-engines.com/en/ranking/> (30 January 2016)

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# DB-Engines ranking



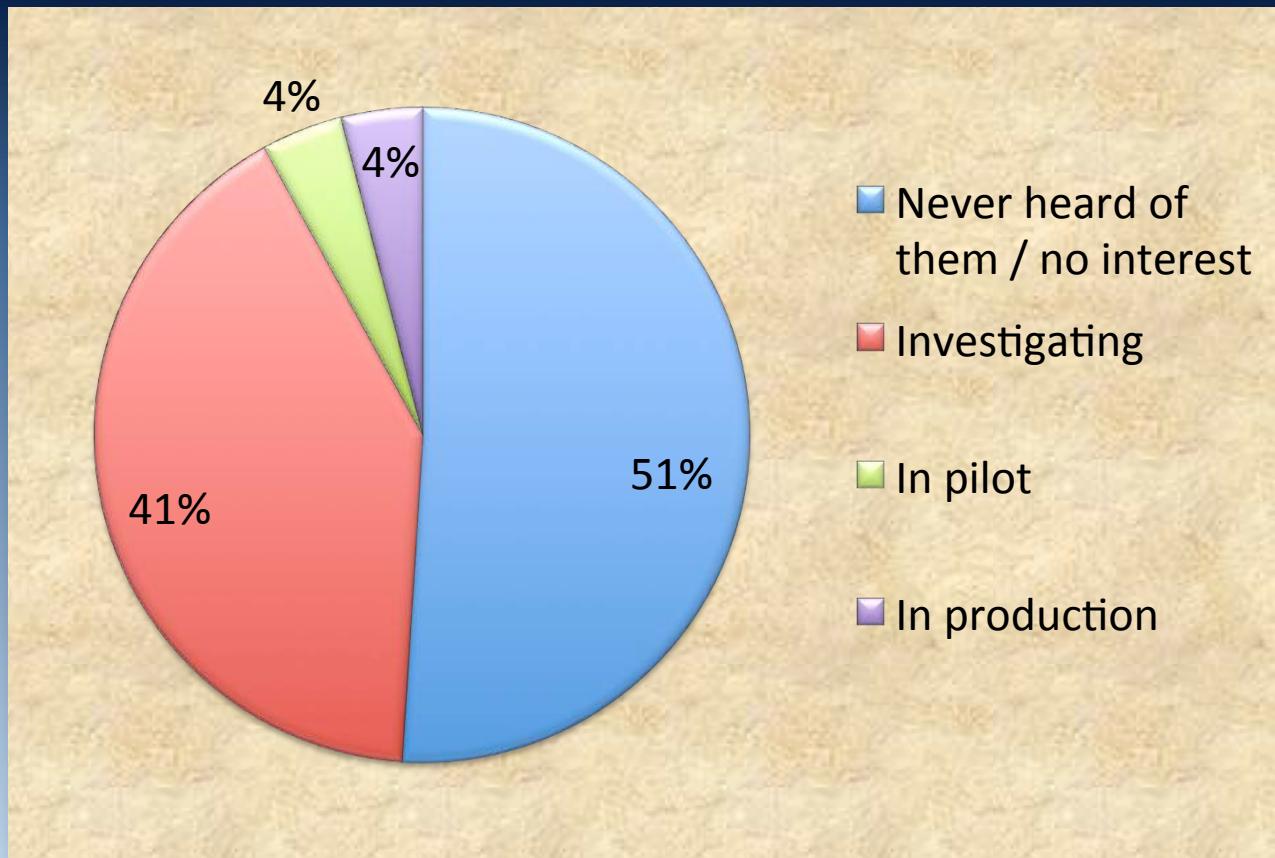
Source: <http://db-engines.com/en/ranking/> (30 January 2016)

# But ...



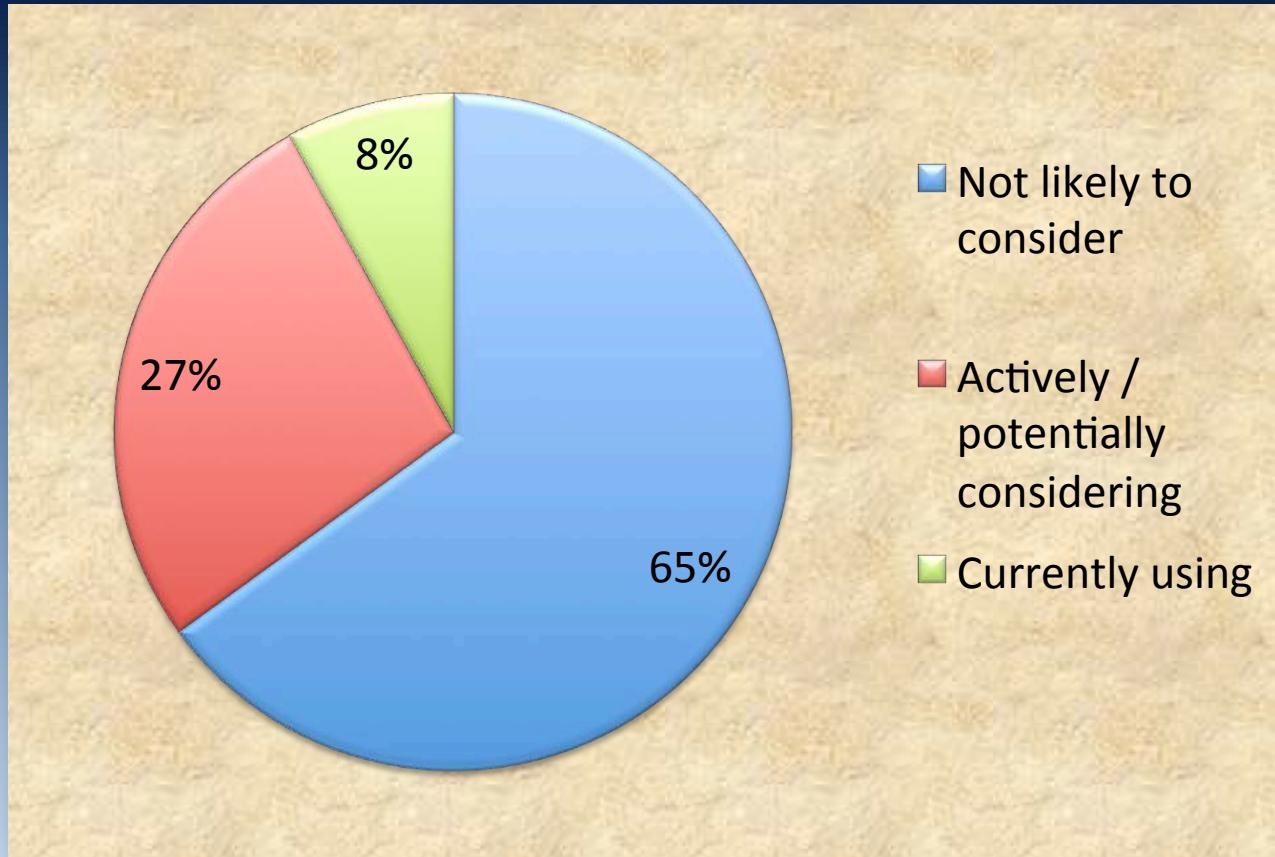
*DB-Engines.com ... a popularity rating based on web mentions/searches and installation numbers are not the same thing ...*

# Use of NoSQL products



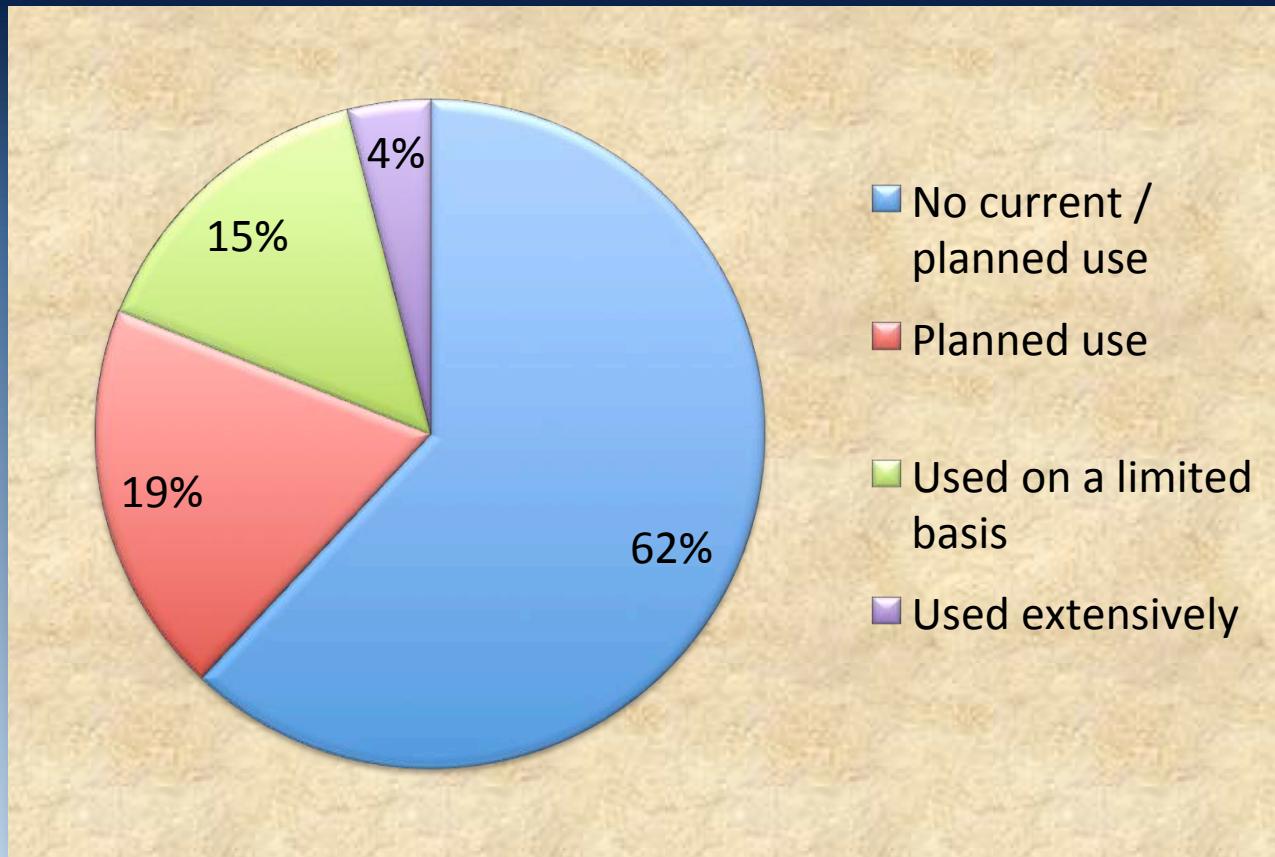
Source: "State of Database Technology 2013" InformationWeek (April 2013)

# NoSQL in enterprise apps



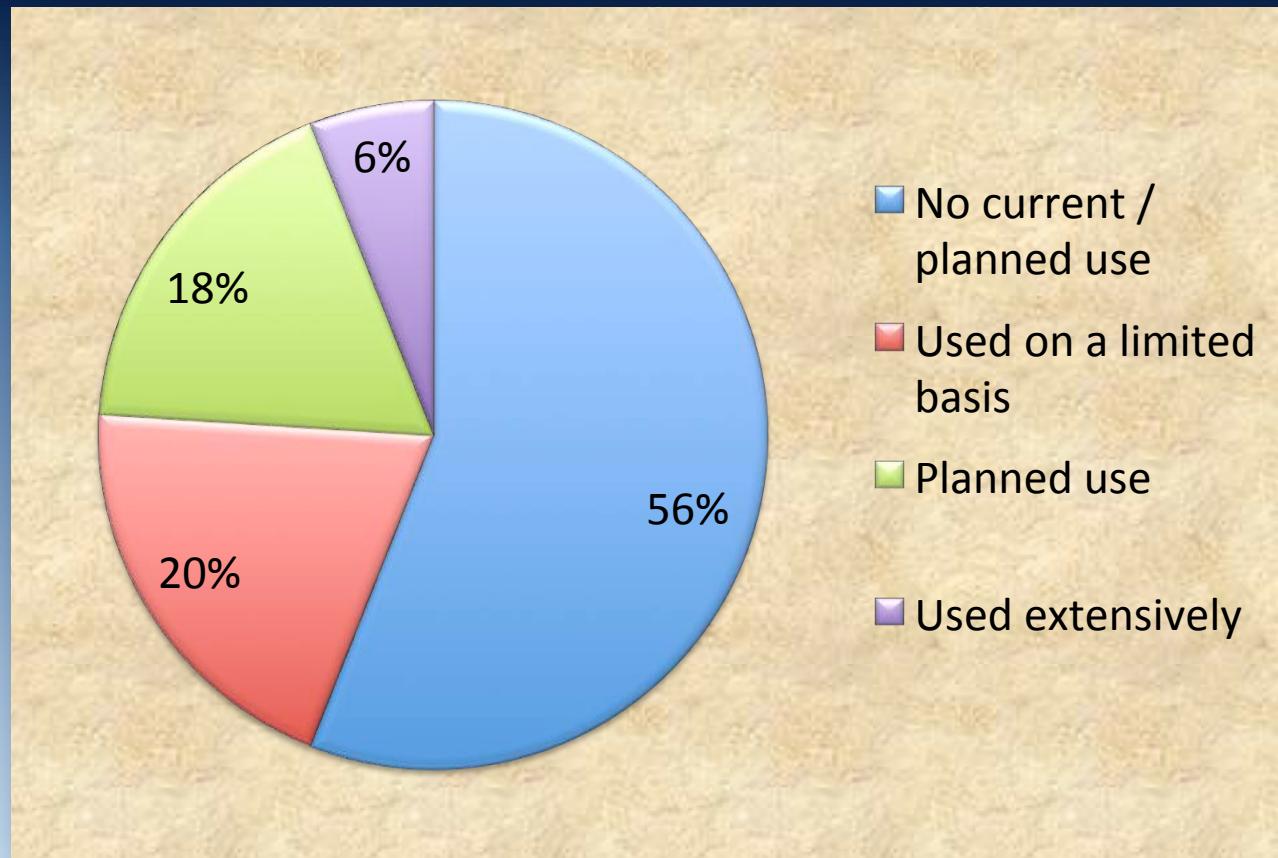
Source: "Cloud Software: Where Next?" InformationWeek (August 2013)

# NoSQL in use 2013



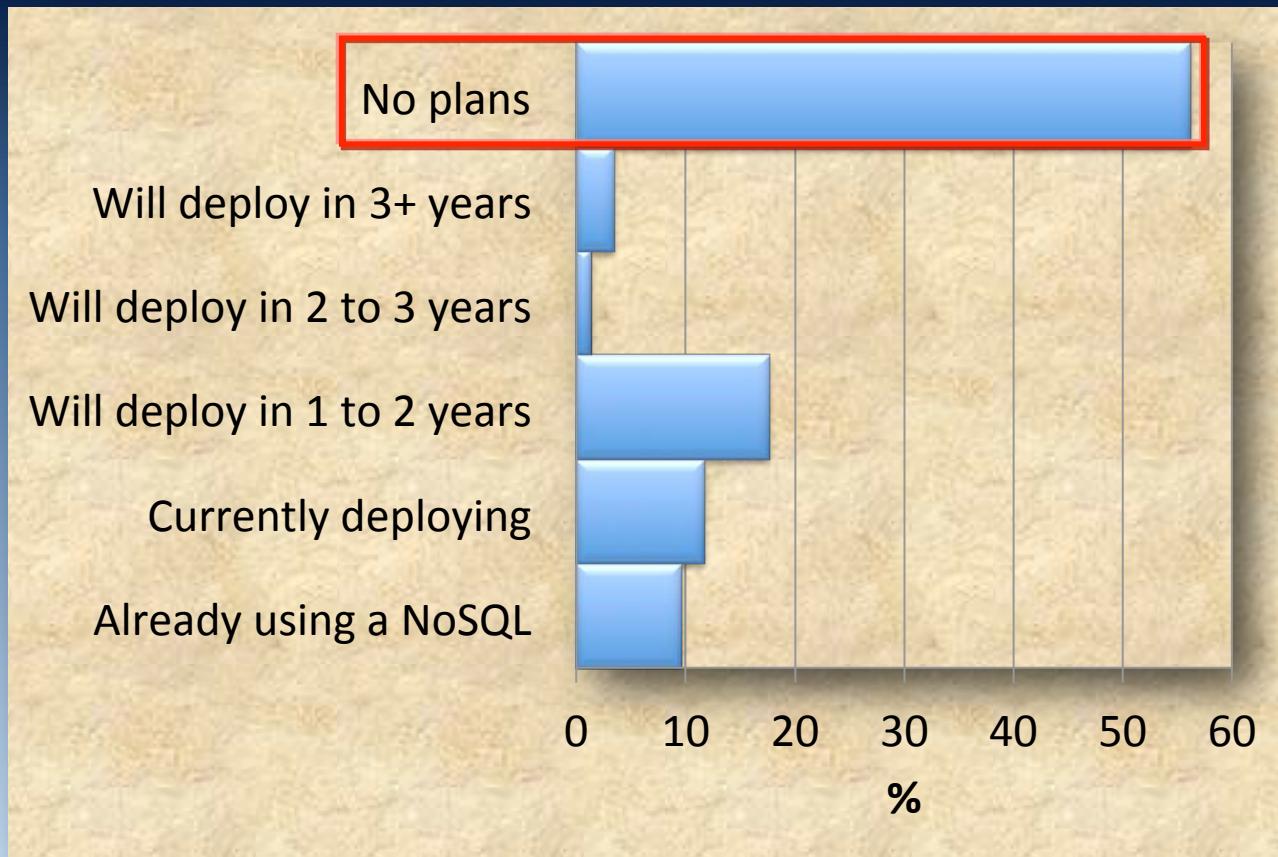
Source: "2014 Analytics, BI, and Information Management Survey" InformationWeek (November 2013)

# NoSQL in use 2014



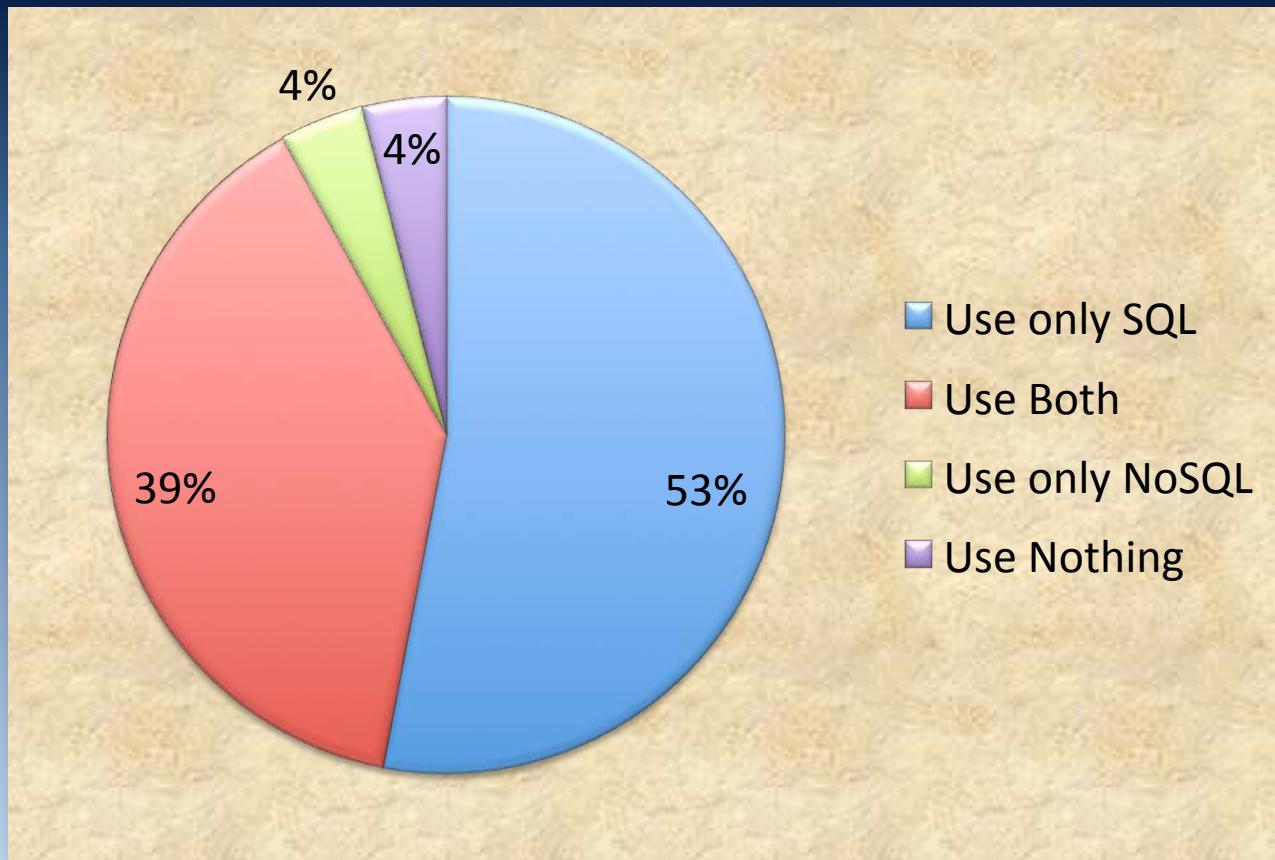
Source: "2015 Analytics & BI Survey" InformationWeek (December 2014)

# Does your company currently have plans to adopt NoSQL?



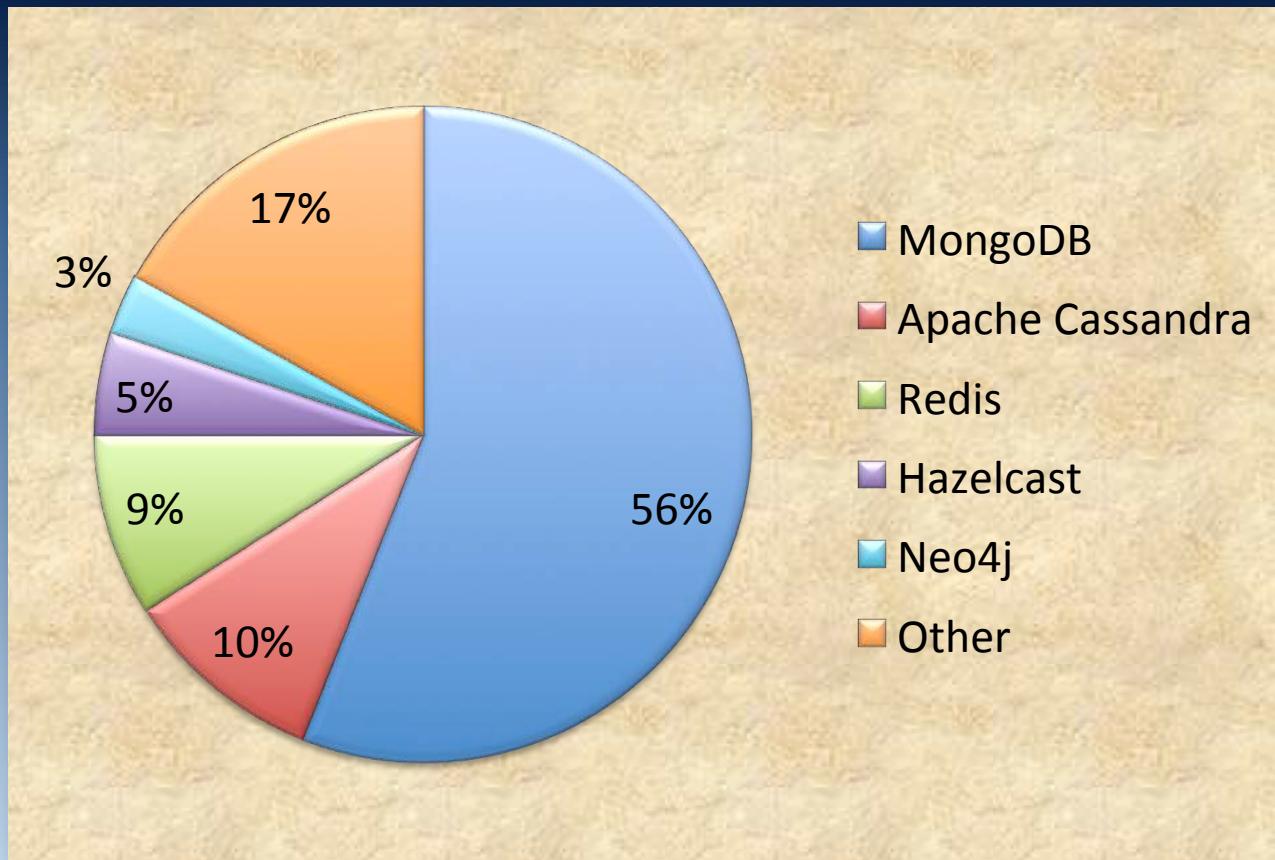
Source: "The Real World of The Database Administrator" Elliot King (March 2015)

# SQL, NoSQL or both?



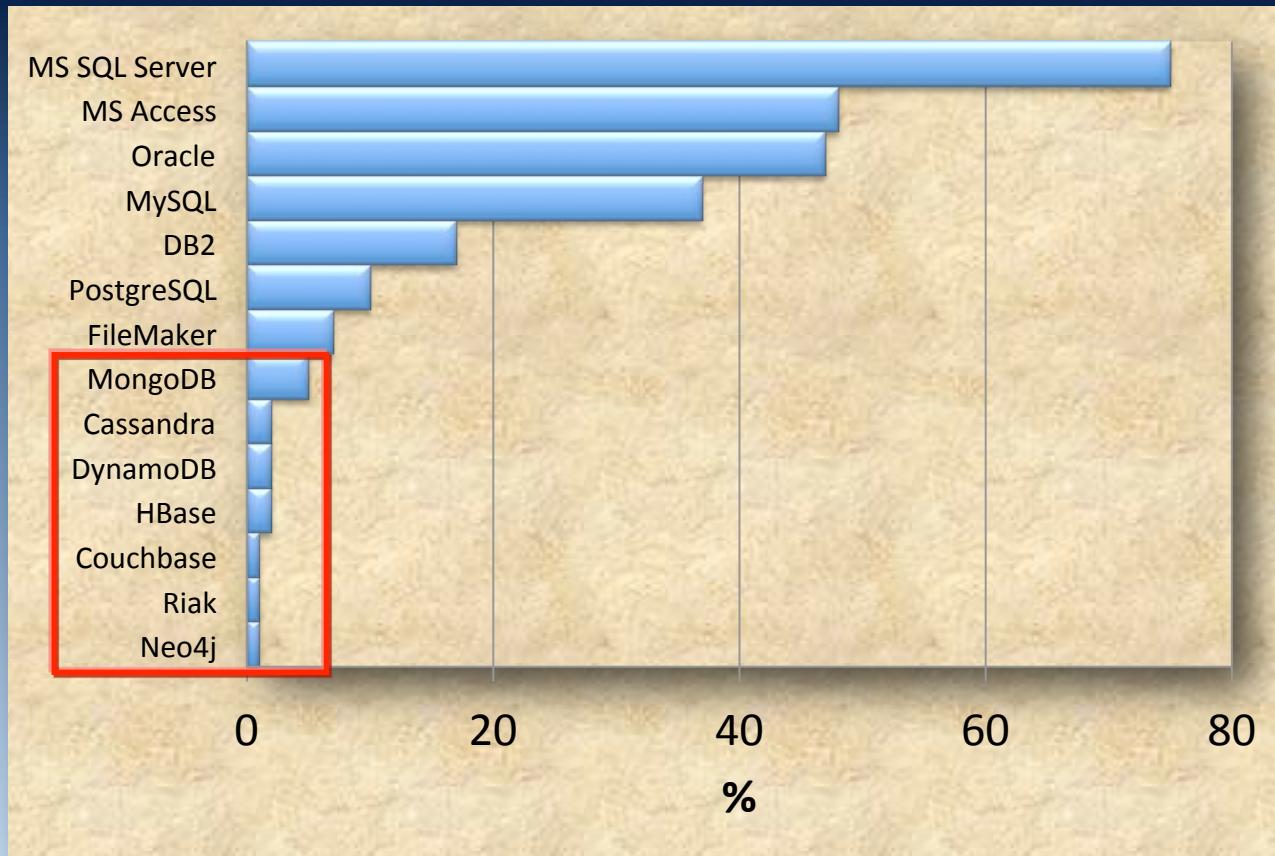
Source: “Java Tools & Technologies Landscape for 2014” ZeroTurnaround (May 2014)

# Primary NoSQL technology



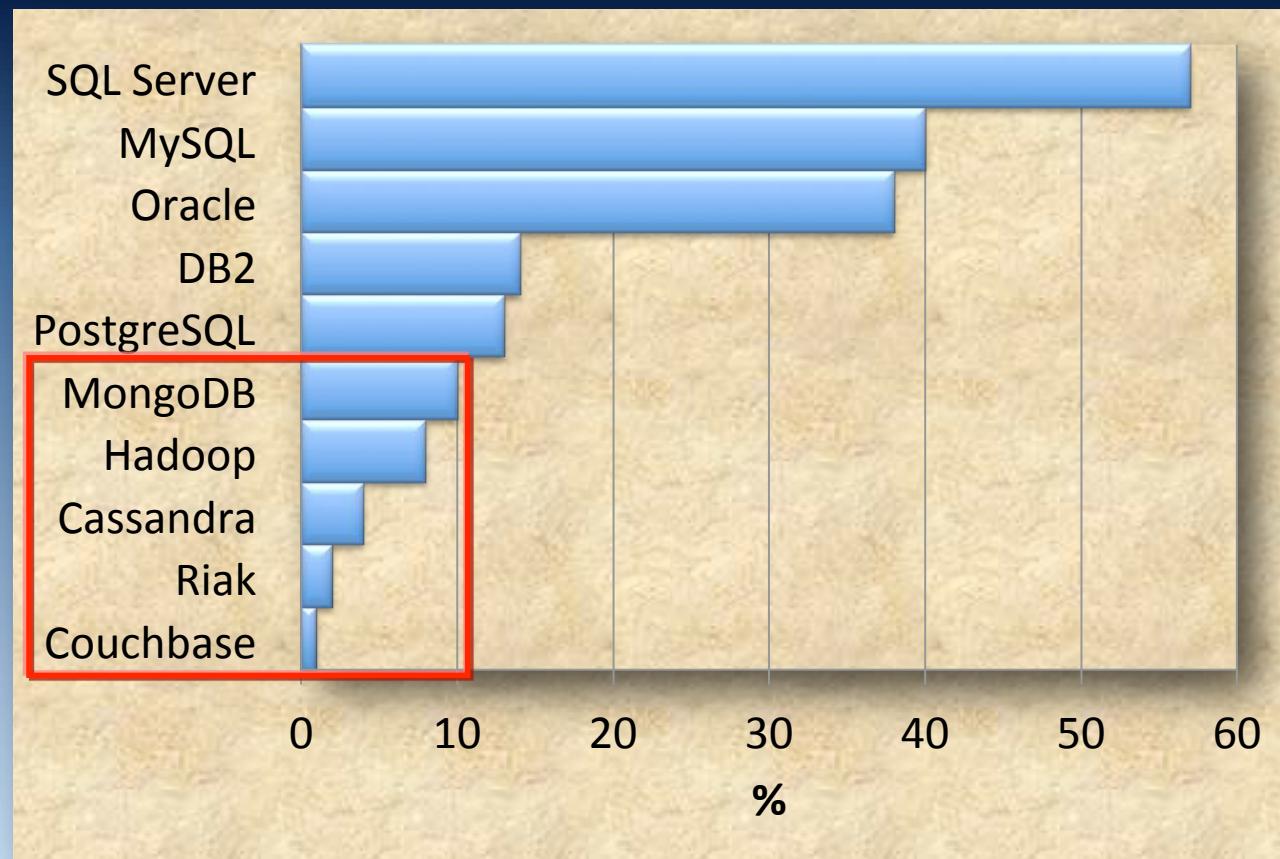
Source: "Java Tools & Technologies Landscape for 2014" ZeroTurnaround (May 2014)

# Databases in use



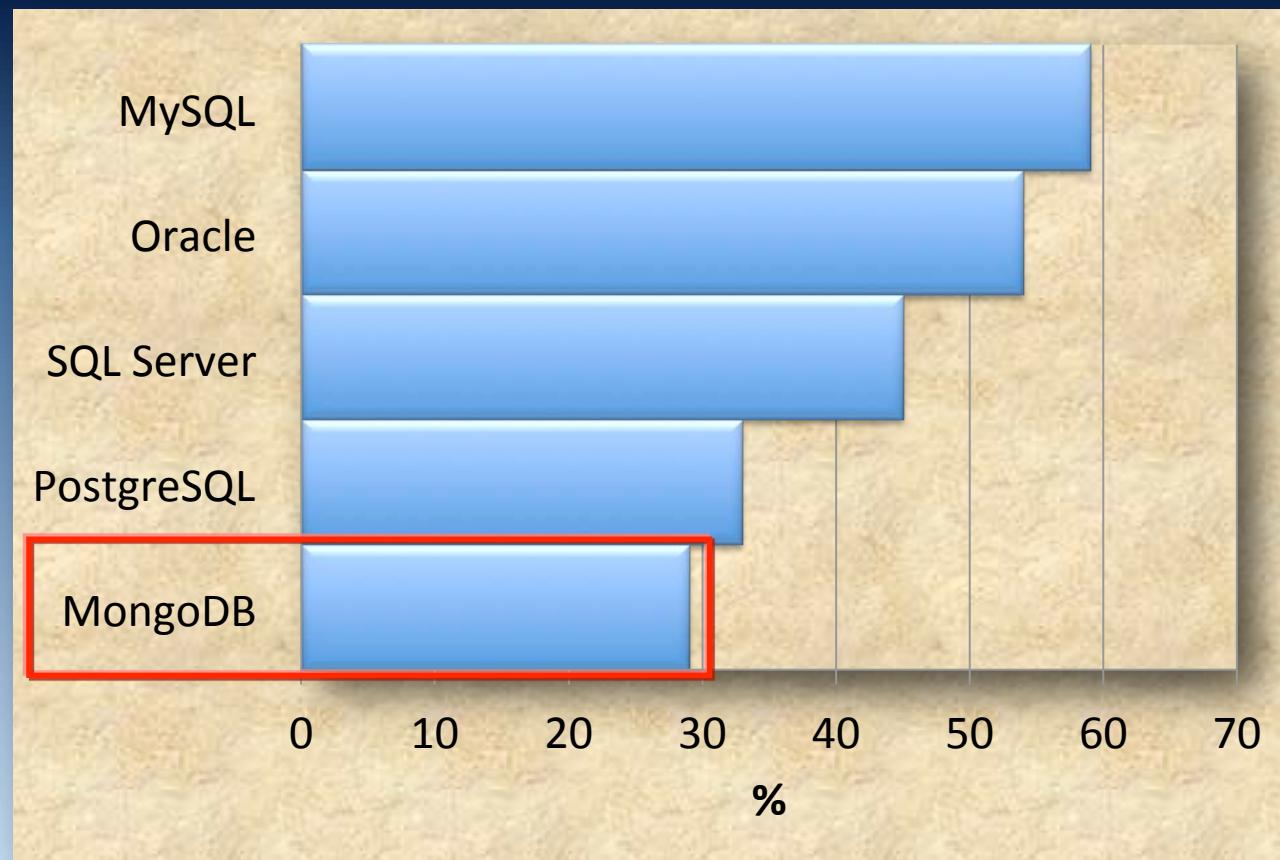
Source: "2014 State of Database Technology" InformationWeek (March 2014)

# What database(s) does your company currently use?



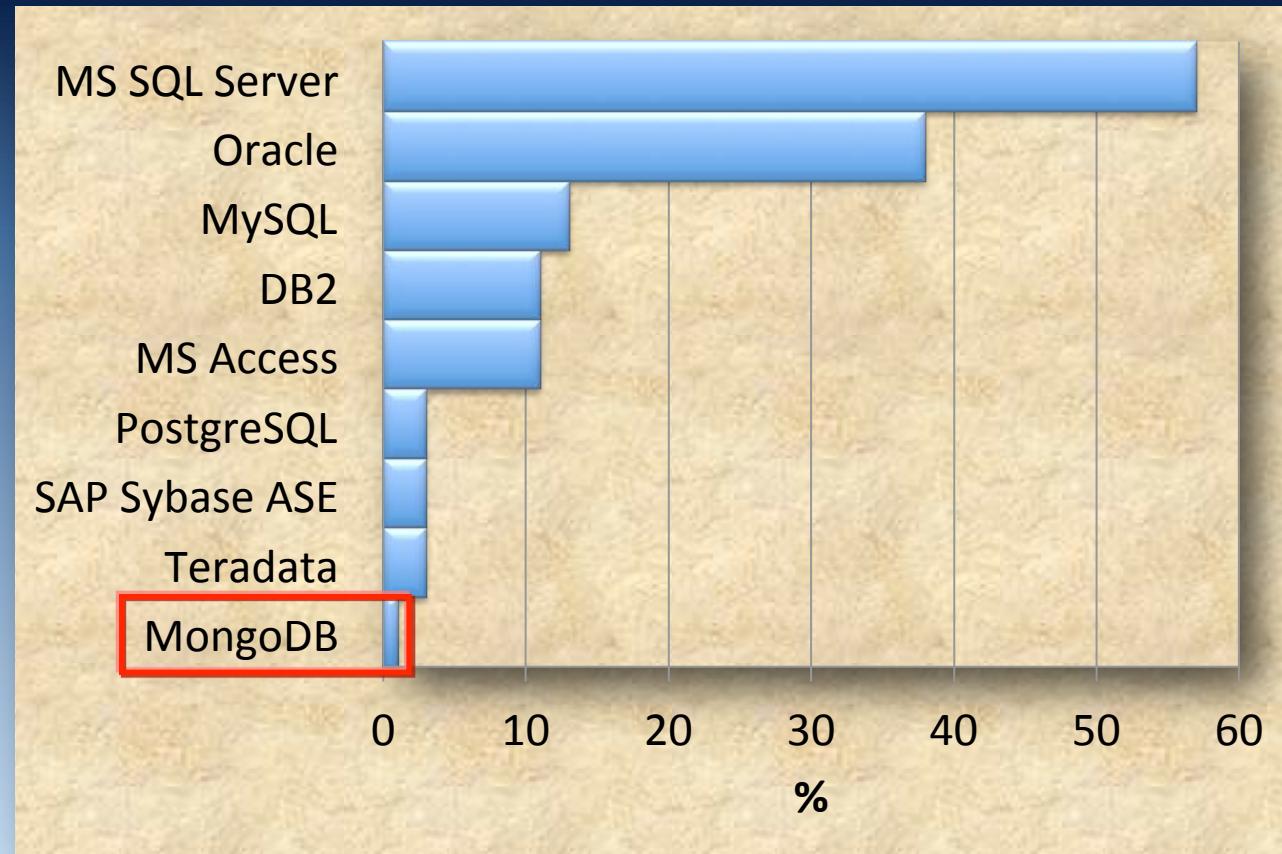
Source: <http://www.tesora.com/resources/infographic>

# Which databases does your organization use?



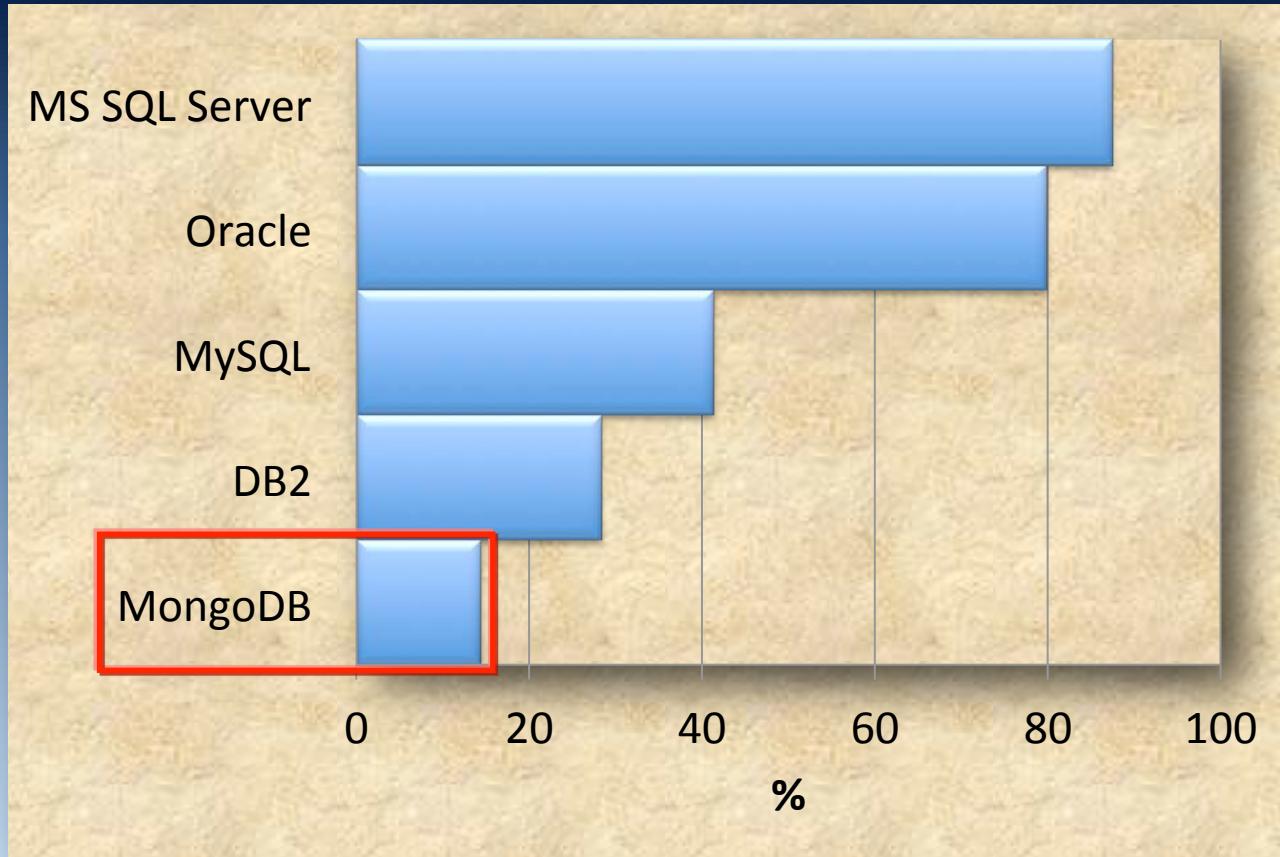
Source: “Guide to Big Data” DZone Research (2014)

# Databases used for most critical functions



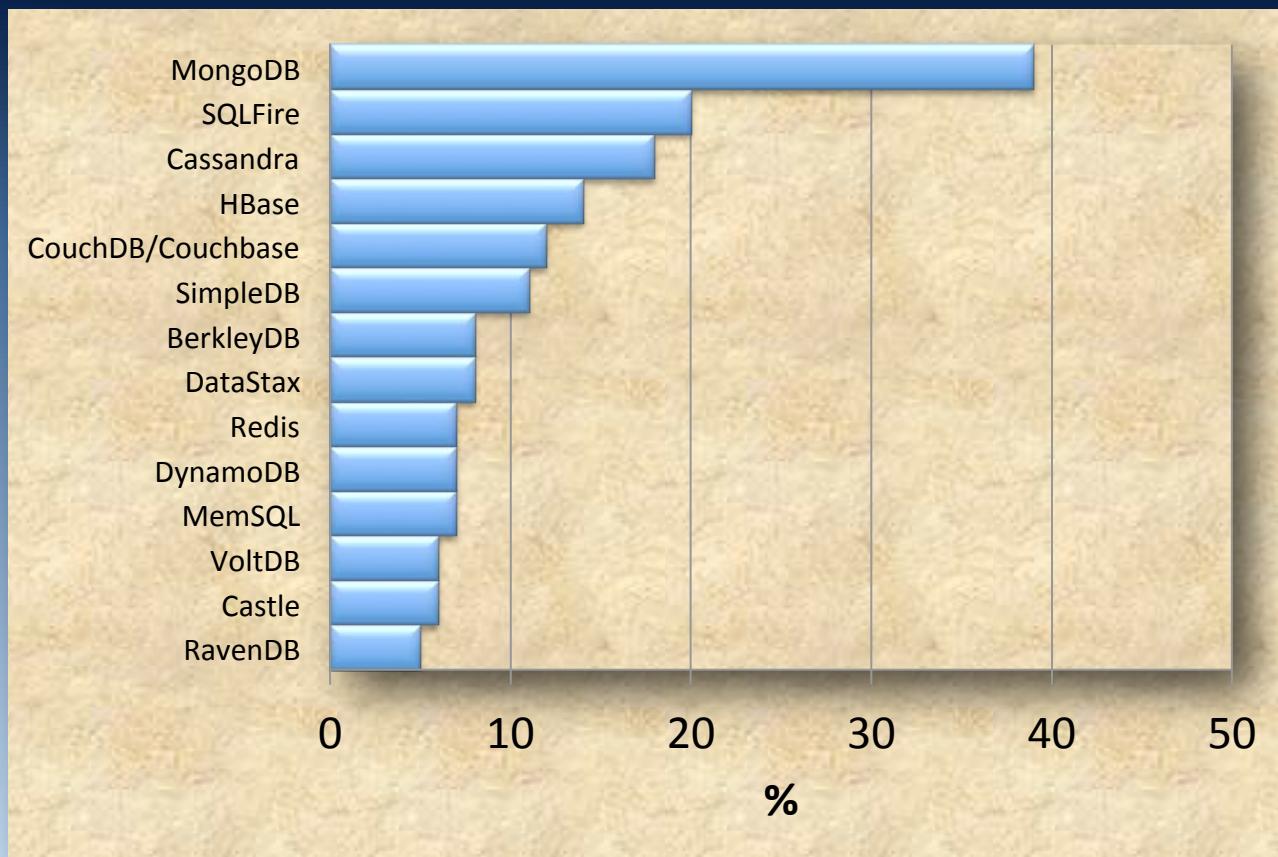
Source: "2014 State of Database Technology" InformationWeek (March 2014)

# What database brands do you have running in your organization?



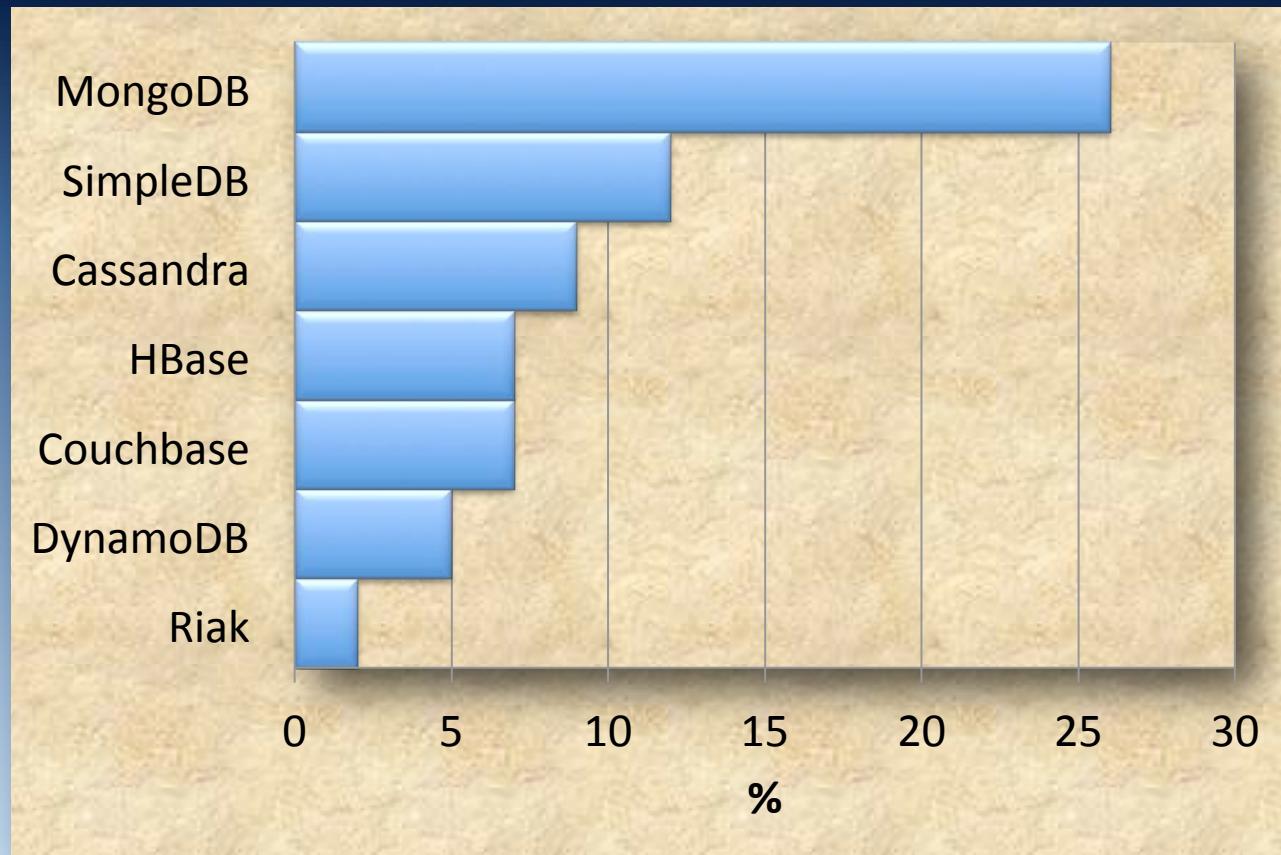
Source: "The Real World of The Database Administrator" Elliot King (March 2015)

# NoSQL, NewSQL, or non-relational data store technology adoption



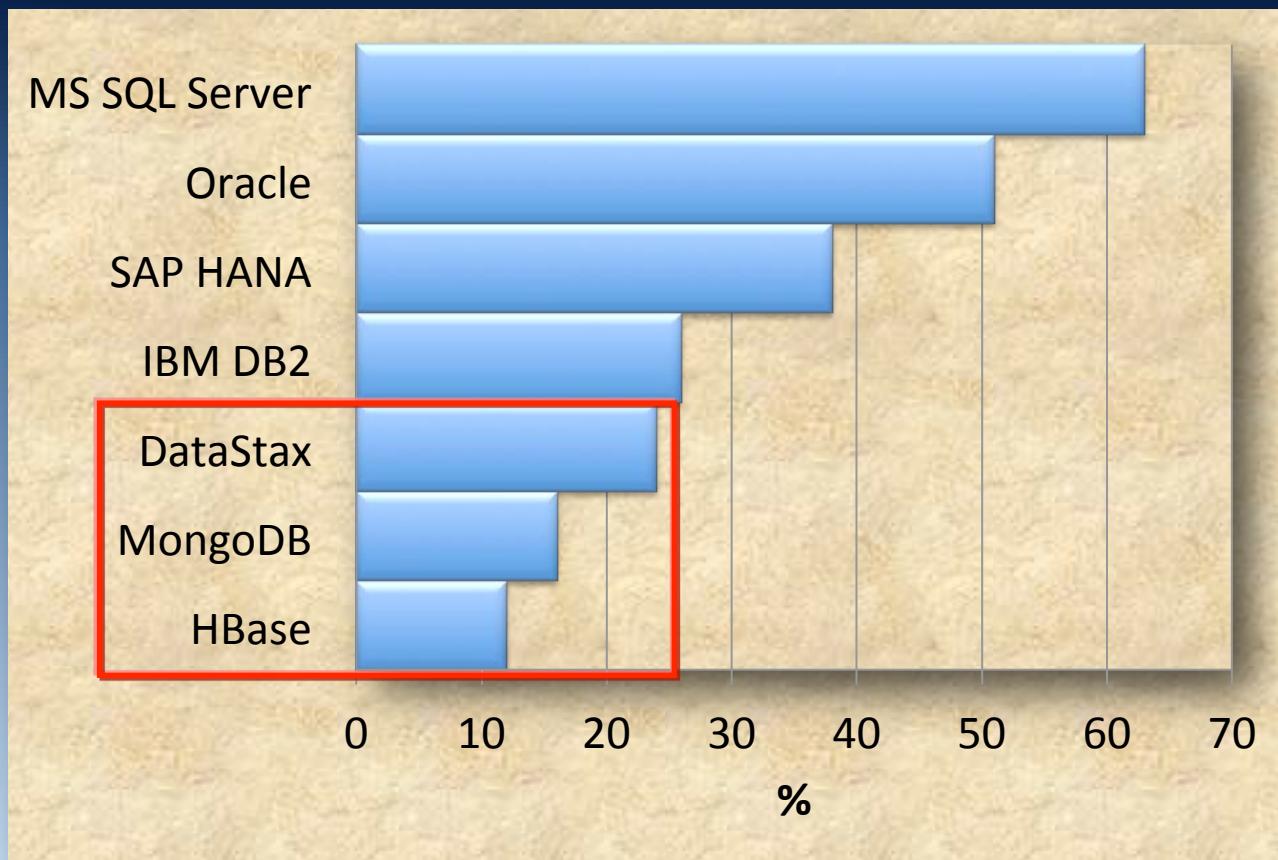
Source: “2014 Data Connectivity Outlook” Progress Software (November 2013)

# NoSQL or non-relational data store technology adoption



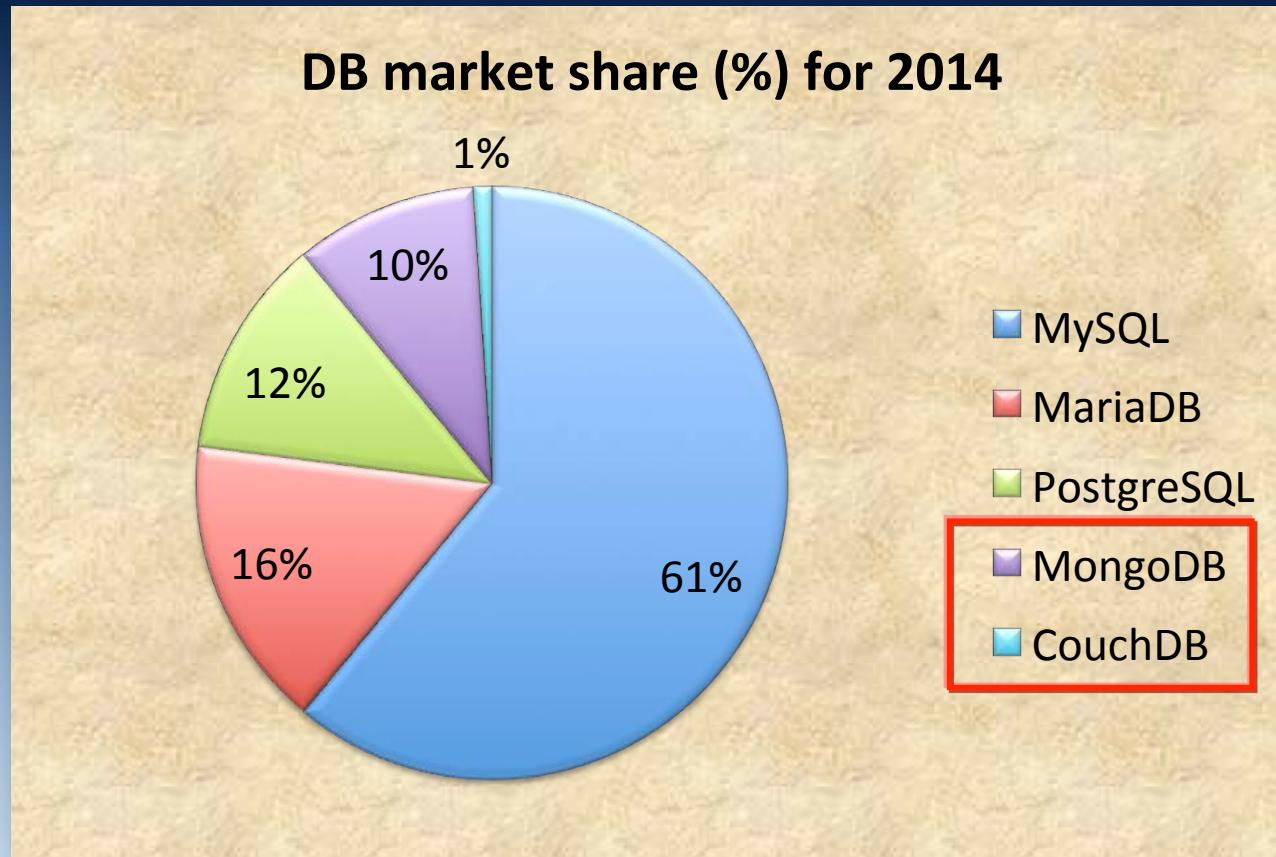
Source: "2015 Data Connectivity Outlook" Progress Software (April 2015)

# When deploying new apps, which DB alternatives do you evaluate?



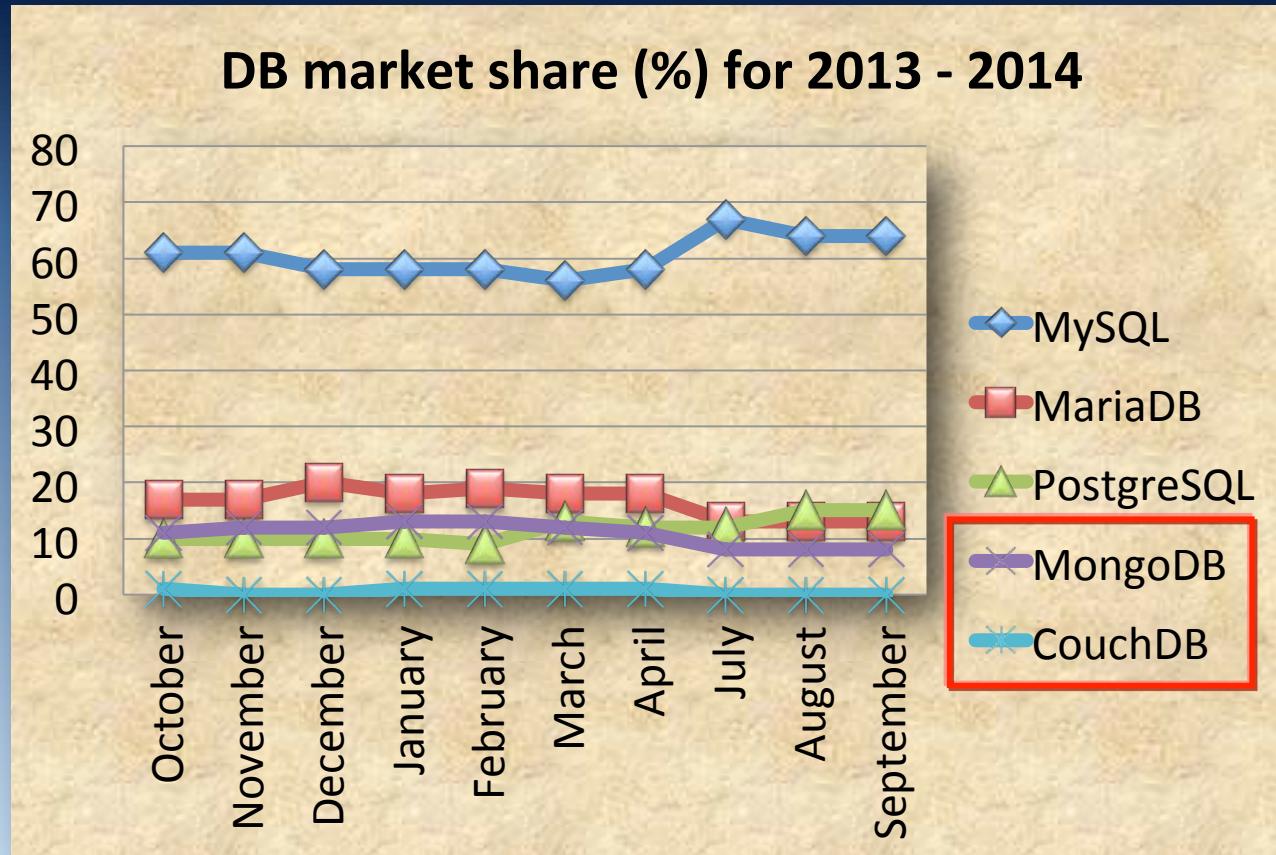
Source: Cowen and Company Mid-Year 2015 IT Spending Survey (May 2015)

# Hosting example ...



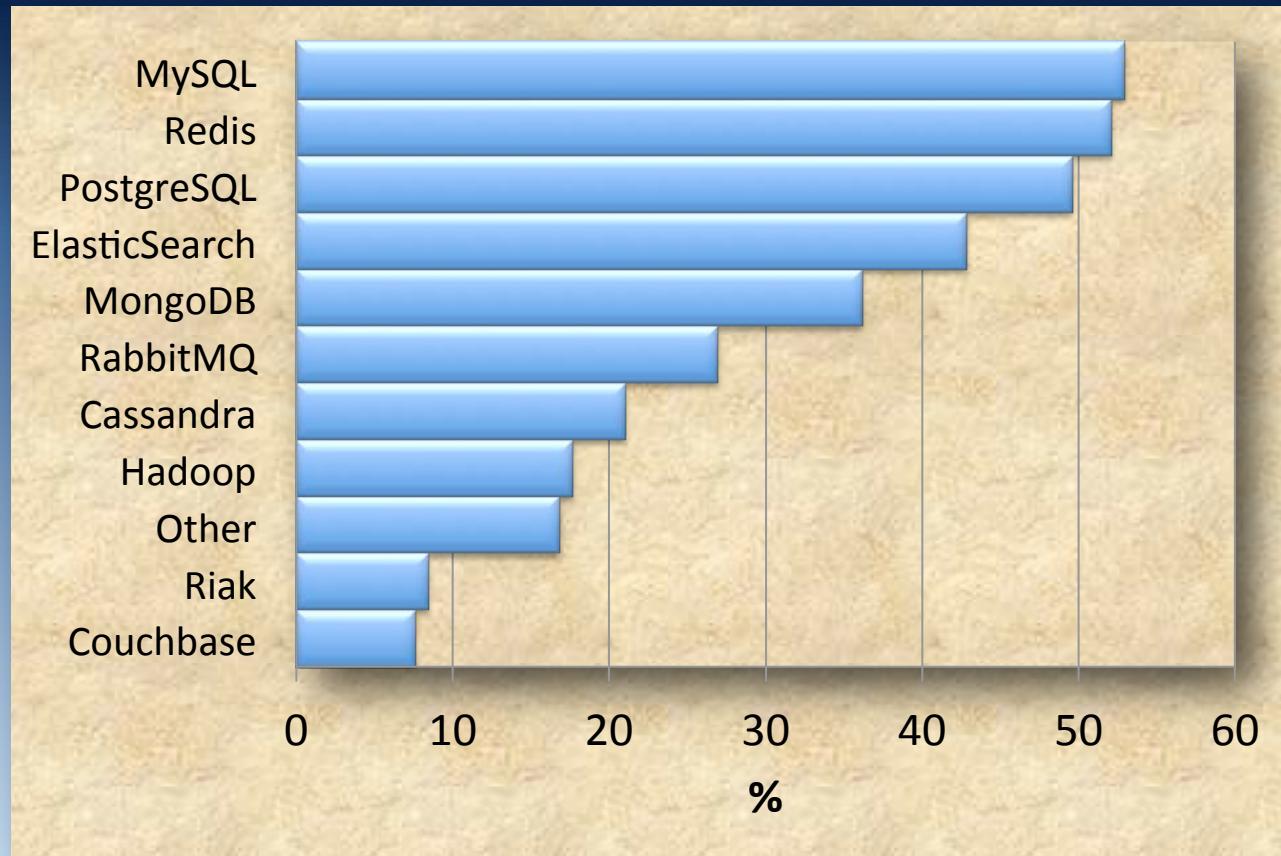
Source: "Software Stacks Market Share: 2014 Summary" Tetiana Markova (13 January 2015)

# Hosting example



Source: Jelastic

# Which DB are you using or do you plan to use in your Container?



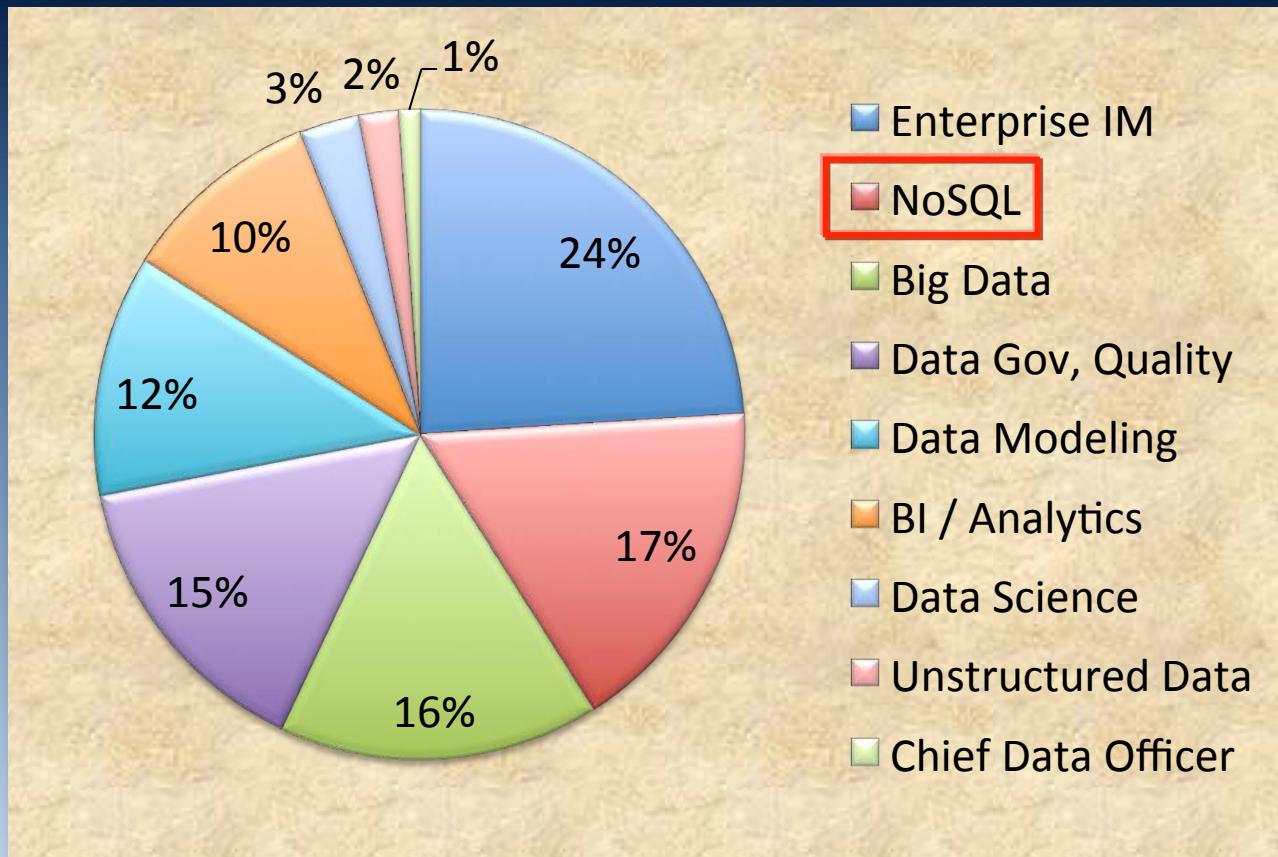
Source: "The Current State of Container Usage" ClusterHQ and DevOps.com (June 2015)

# Top technologies running on Docker



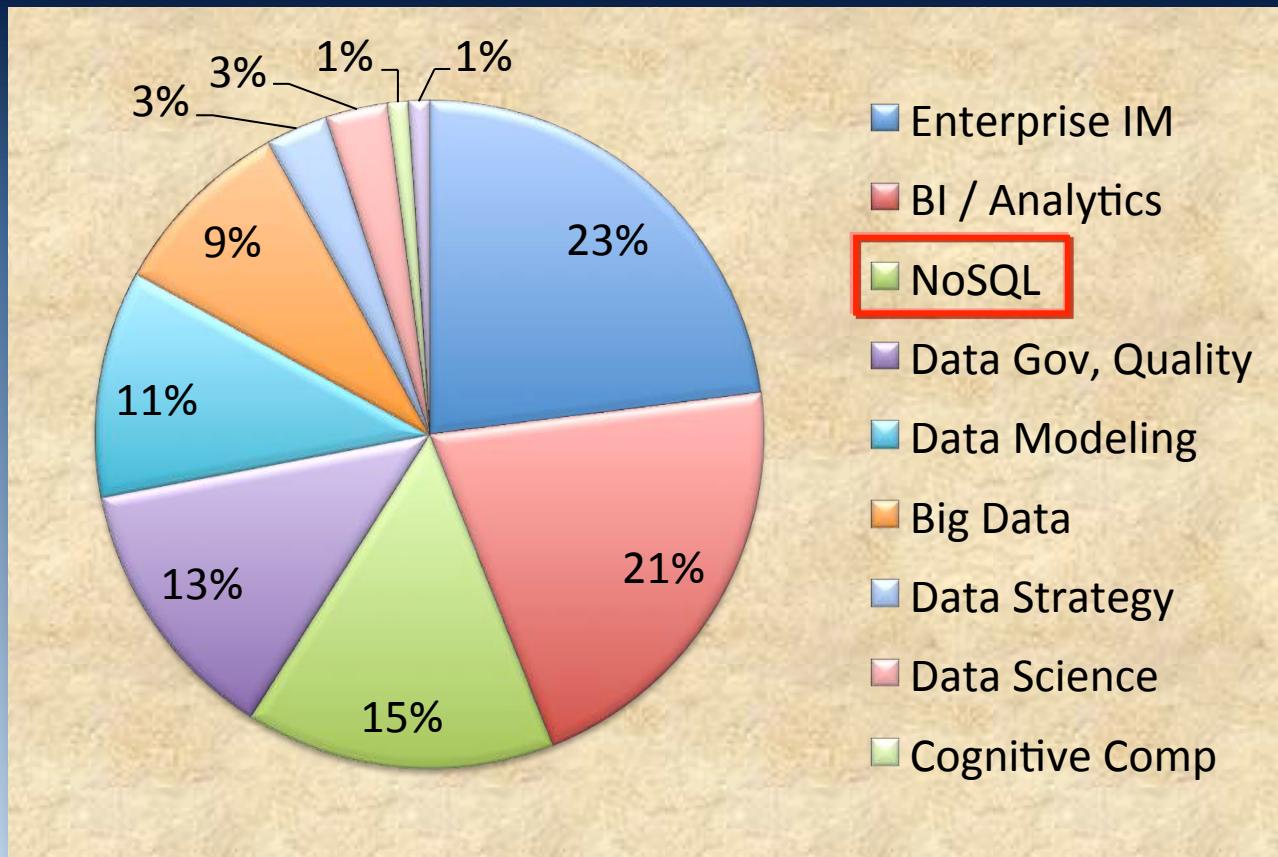
Source: "8 Surprising Facts About Real Docker Adoption" Datadog (December 2015)

# Top 2013 DM topics



Source: "Top 20 Hottest Data Management Posts Year-to-Date 2014" Shannon Kempe (2 July 2014)

# Top 2014 DM topics



Source: "Top 20 Hottest Data Management Posts Year-to-Date 2015" Shannon Kempe (2 July 2015)

# NoSQL



STARRING AGILE DEV AND POLY GLOT

EPISODE IV: A NEW HOPE FOR DEVELOPERS

# NoSQL THE MOVIE!

THE WAY DEVELOPERS REALLY THINK

01.01.2013

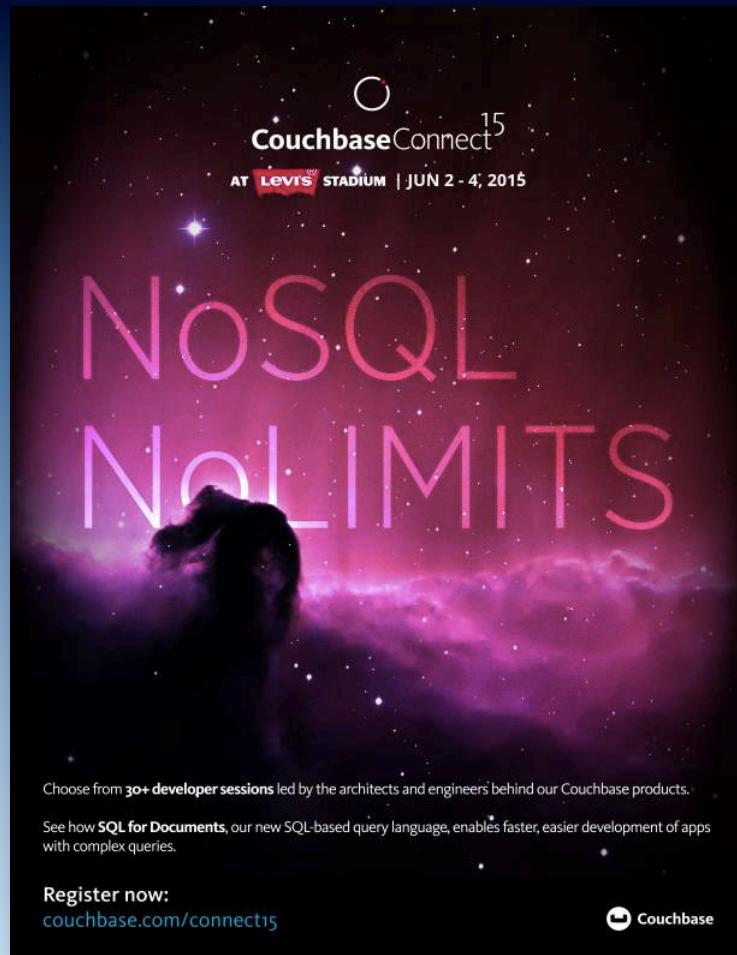
DIRECTED BY AKMAL CHAUDHRI PRODUCED BY AKMAL CHAUDHRI WRITTEN BY AKMAL CHAUDHRI DISTRIBUTED BY AKMAL CHAUDHRI SOUNDTRACK BY  
AKMAL CHAUDHRI MUSIC BY AKMAL CHAUDHRI EDITED BY AKMAL CHAUDHRI COPYRIGHT AKMAL CHAUDHRI

PG PARENTAL GUIDANCE SUGGESTED

SOME MATERIAL MAY NOT BE SUITABLE FOR CHILDREN



# Imitation is the sincerest form of flattery - thank you Couchbase!



# “The Stars, Like Dust”



*... a squadron of small, flitting ships that had struck and vanished, then struck again, and made scrap of the lumbering titanic ships that had opposed them ... abandoning power alone, stressed speed and co-operation ...*

-- Isaac Asimov

# NoSQL The Movie!

Sequel



# History in No-tation

**1970: NoSQL = We have no SQL**

**1980: NoSQL = Know SQL**

**2000: NoSQL = No SQL!**

**2005: NoSQL = Not only SQL**

**2013: NoSQL = No, SQL!**

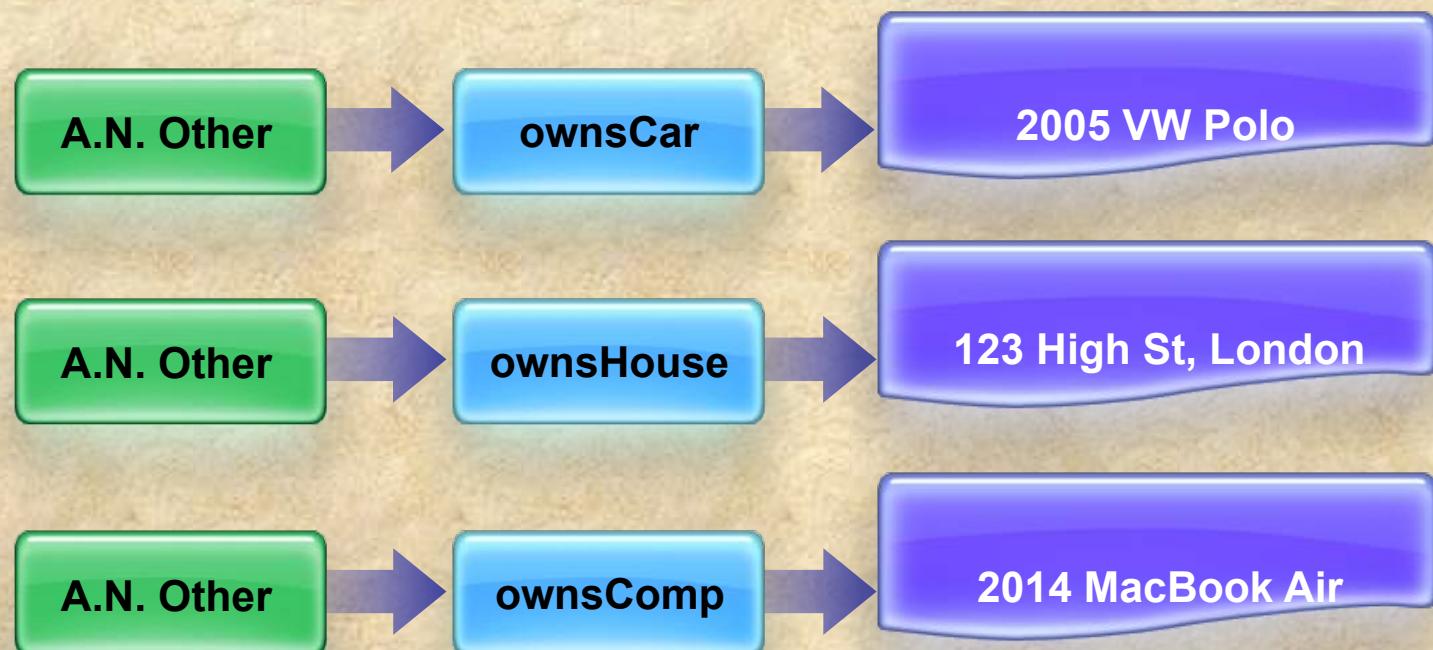
# The meme changed



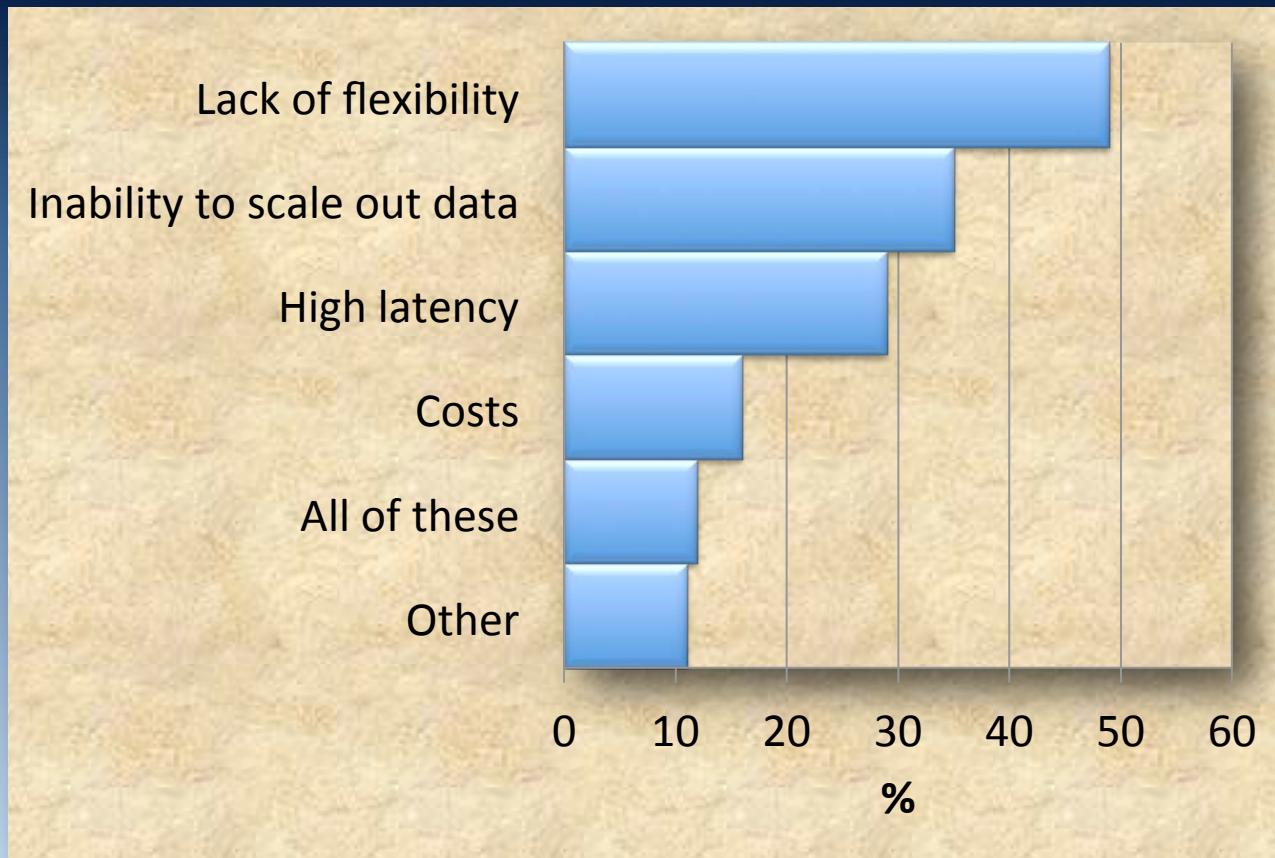
# Why did NoSQL datastores arise?

- Some applications need very few database features, but need high scale
- Desire to avoid data/schema pre-design altogether for simple applications
- Need for a low-latency, low-overhead API to access data
- Simplicity - do not need fancy indexing - just fast lookup by primary key

# Scenario where NoSQL is useful

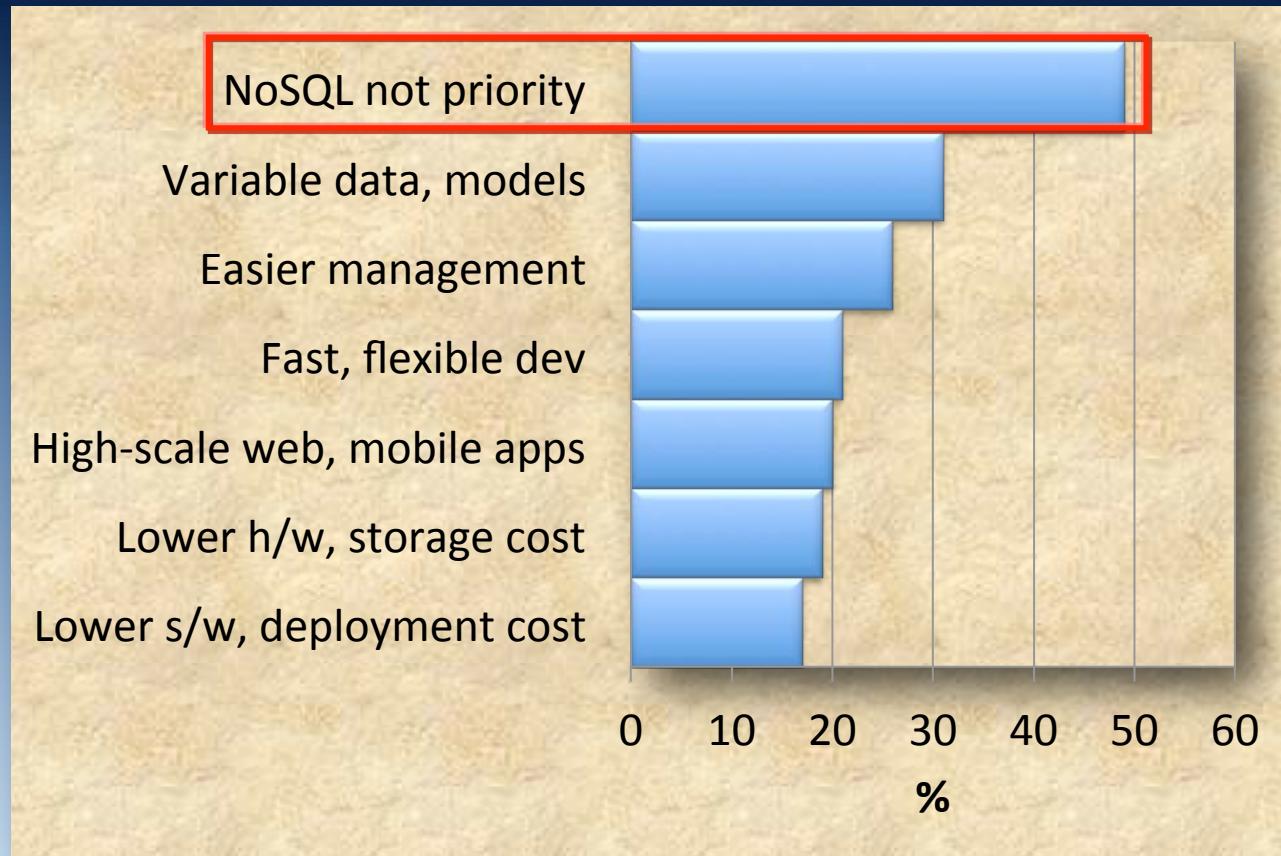


# What is the biggest DM problem driving your use of NoSQL?



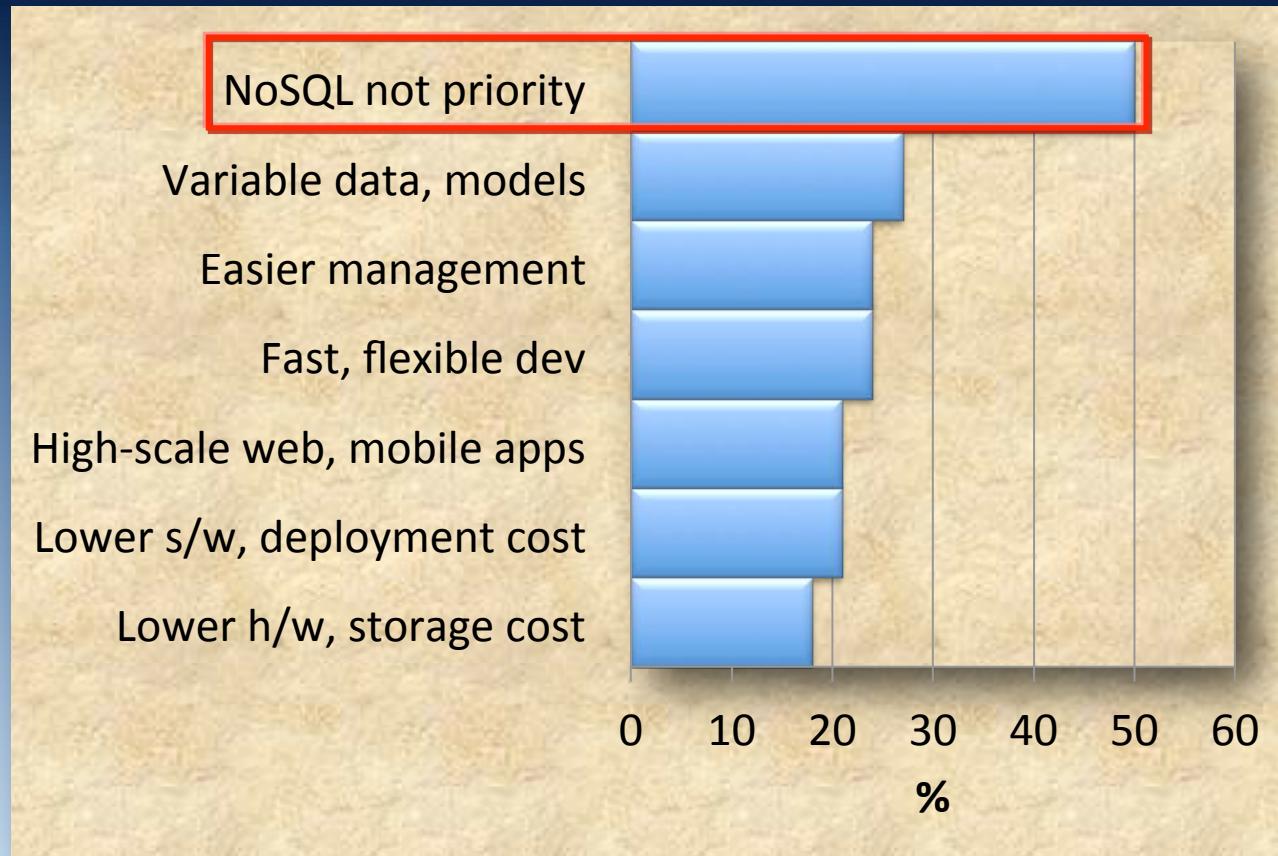
Source: Couchbase NoSQL Survey (December 2011)

# Eye on NoSQL 2013



Source: "2014 Analytics, BI, and Information Management Survey" InformationWeek (November 2013)

# Eye on NoSQL 2014



Source: "2015 Analytics & BI Survey" InformationWeek (December 2014)

# Schema-free



Source: Shutterstock Image ID 128628794

# But ...



*We started using mongo early 2009, and even just one year out it feels so much more painful to maintain than our Postgres or MySQL systems that have been around since 1999! My theory is that NoSQL sacrifices maintenance and future development effort for the sake of startup development.*

-- Luke Crouch

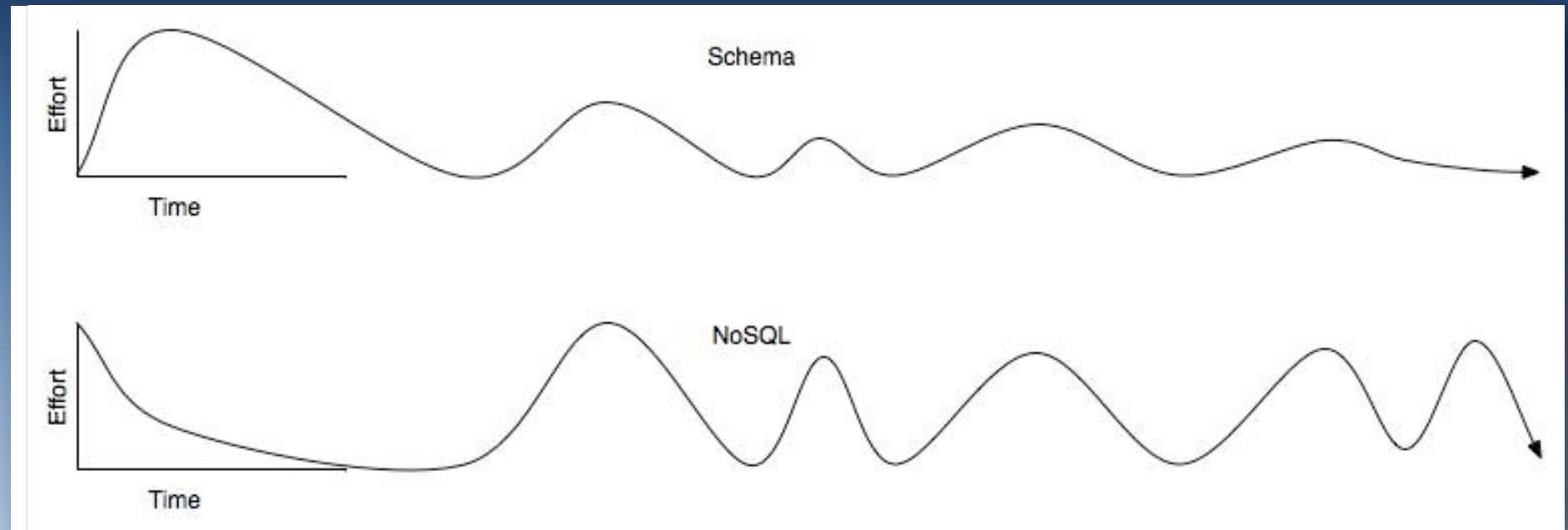
# And ...



*Inquiries from Gartner clients indicate that schema design for NoSQL DBMSs is one of the biggest barriers to adopting this new technology. Simply selecting a NoSQL DBMS and hoping the underlying technology will accommodate poor design choices will lead to a poorly performing application and database, and to rework.*

-- Adam M. Ronthal and Nick Heudecker

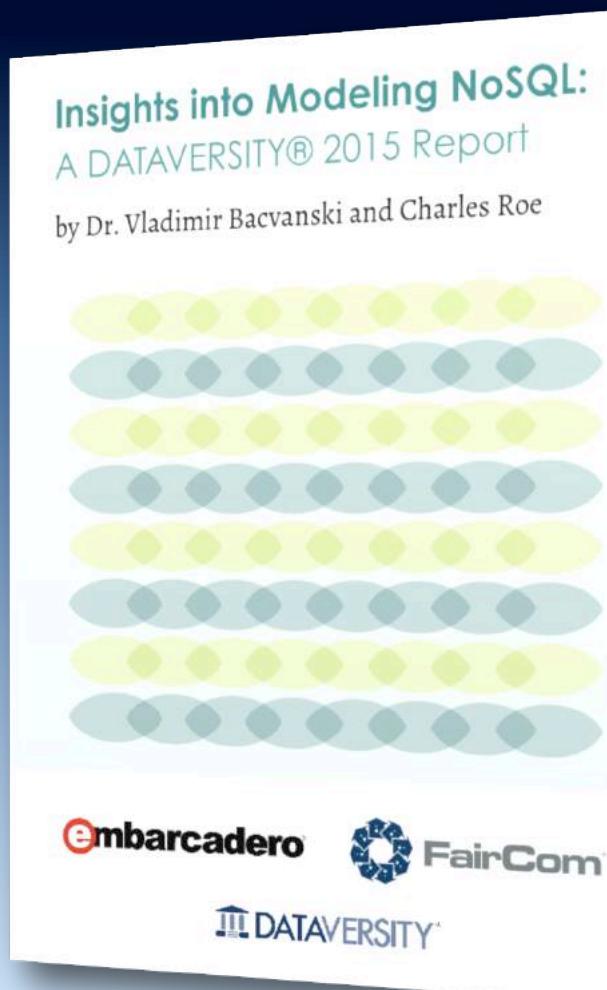
# Schema



Source: Luke Crouch, used with permission

# Data modelling

- 32% do not do data modelling for their NoSQL system, they simply code the application
- 46% of the data modelling with NoSQL is done by the programmer who uses the NoSQL store



Source: "Insights into Modeling NoSQL" Vladimir Bacvanski and Charles Roe (2015)

# Big data

Variety



Velocity



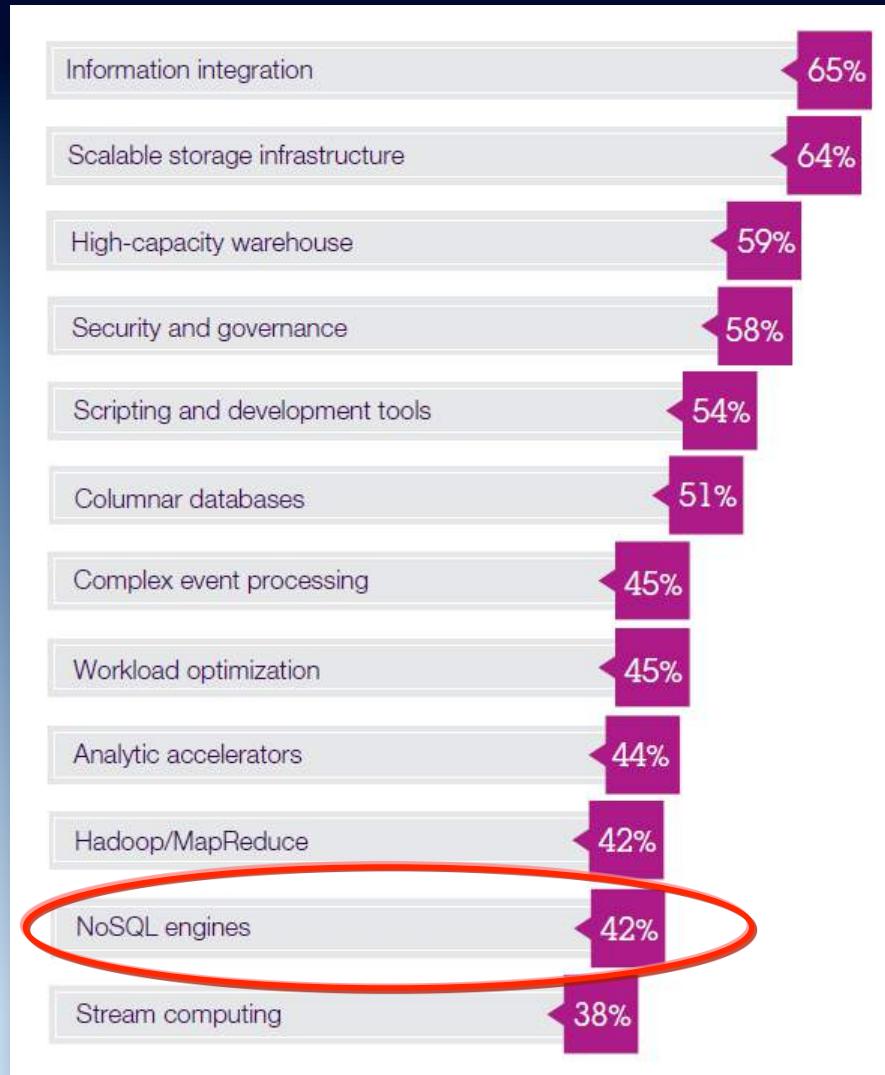
Volume



# What is Big Data?

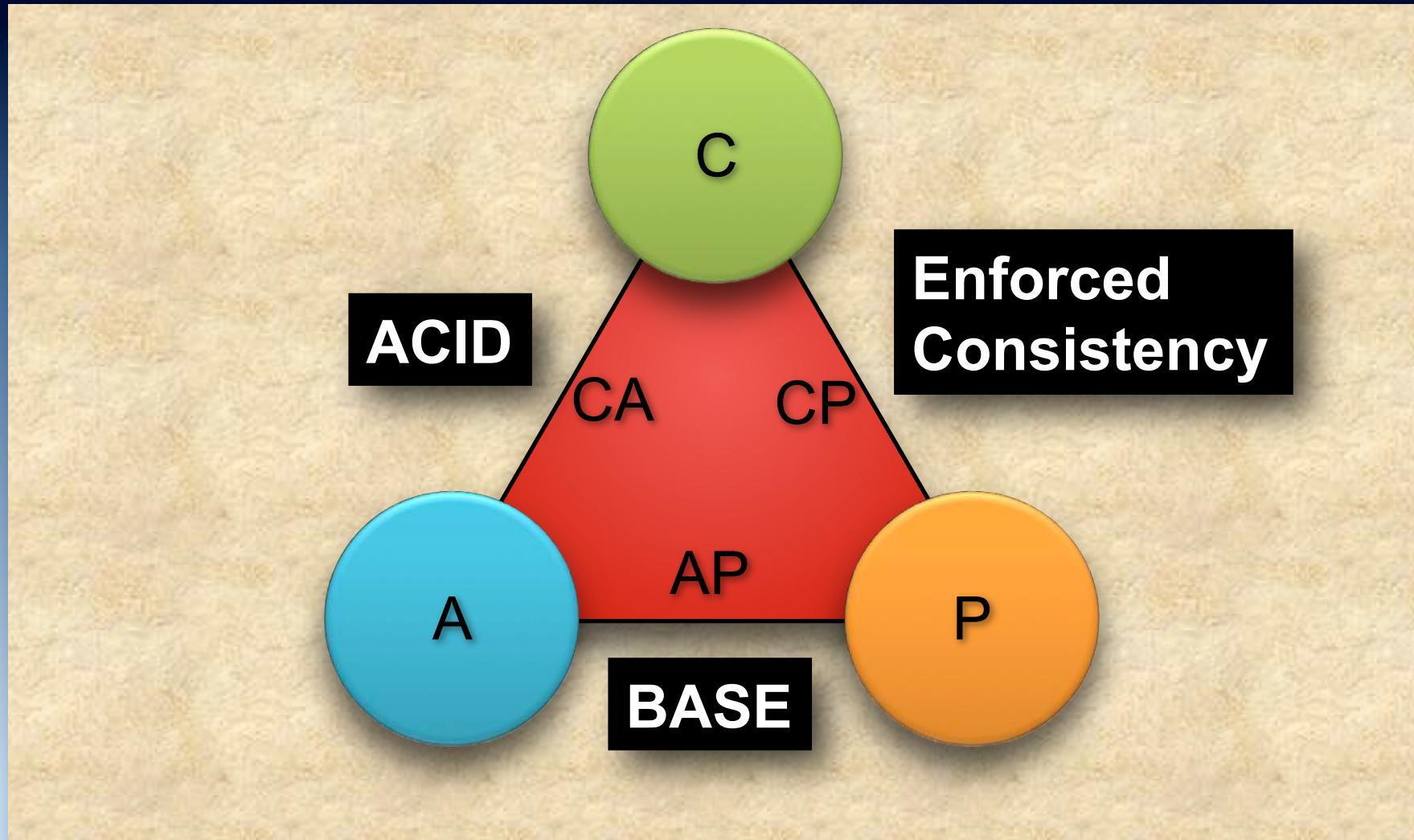
|           |                              |          |
|-----------|------------------------------|----------|
| Byte      | : One grain of rice          | Hobbyist |
| Kilobyte  | : Cup of rice                |          |
| Megabyte  | : 8 bags of rice             | Desktop  |
| Gigabyte  | : 3 semi trucks              |          |
| Terabyte  | : 2 container ships          | Internet |
| Petabyte  | : Blankets Manhattan         |          |
| Exabyte   | : Blankets west coast states | Big Data |
| Zettabyte | : Fills the Pacific Ocean    |          |
| Yottabyte | : Earth size rice ball       |          |

# Big data infrastructure



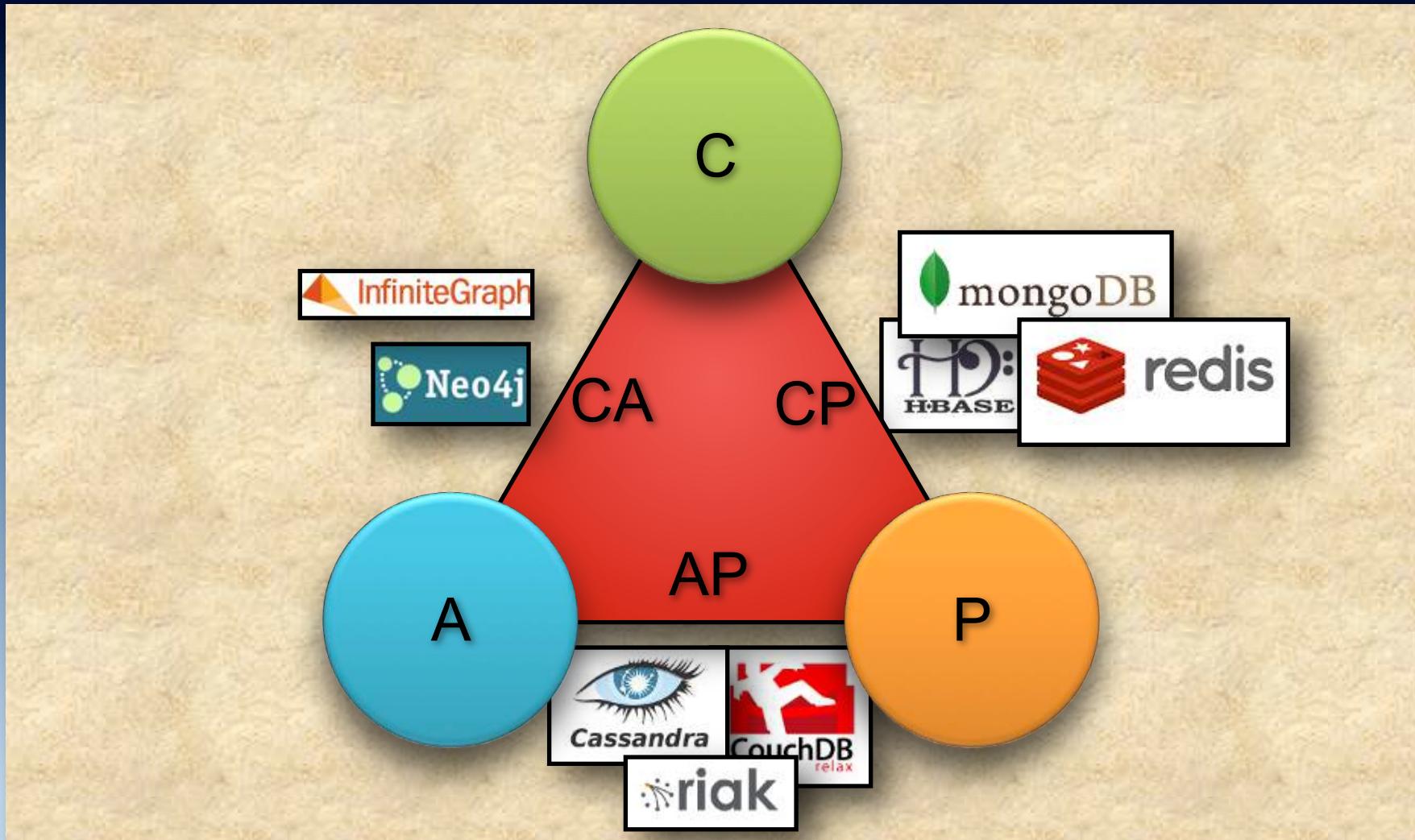
Source: "Analytics: The real-world use of big data" IBM and University of Oxford (October 2012)

# Brewer's CAP “Theorem” ...



Source: After <http://guide.couchdb.org/editions/1/en/consistency.html>

# Brewer's CAP “Theorem”



# ACID vs. BASE ...



- Atomicity
- Consistency
- Isolation
- Durability
- Basically Available
- Soft state
- Eventual consistency

# ACID vs. BASE

| ACID   | BASE  |
|--|---|
| <ul style="list-style-type: none"><li>• Strong consistency</li><li>• Isolation</li><li>• Focus on “commit”</li><li>• Nested transactions</li><li>• Conservative (pessimistic)</li><li>• Availability</li><li>• Difficult evolution</li></ul> | <ul style="list-style-type: none"><li>• Weak consistency</li><li>• Availability first</li><li>• Best effort</li><li>• Approximate answers OK</li><li>• Aggressive (optimistic)</li><li>• Simpler, faster</li><li>• Easier evolution</li></ul> |

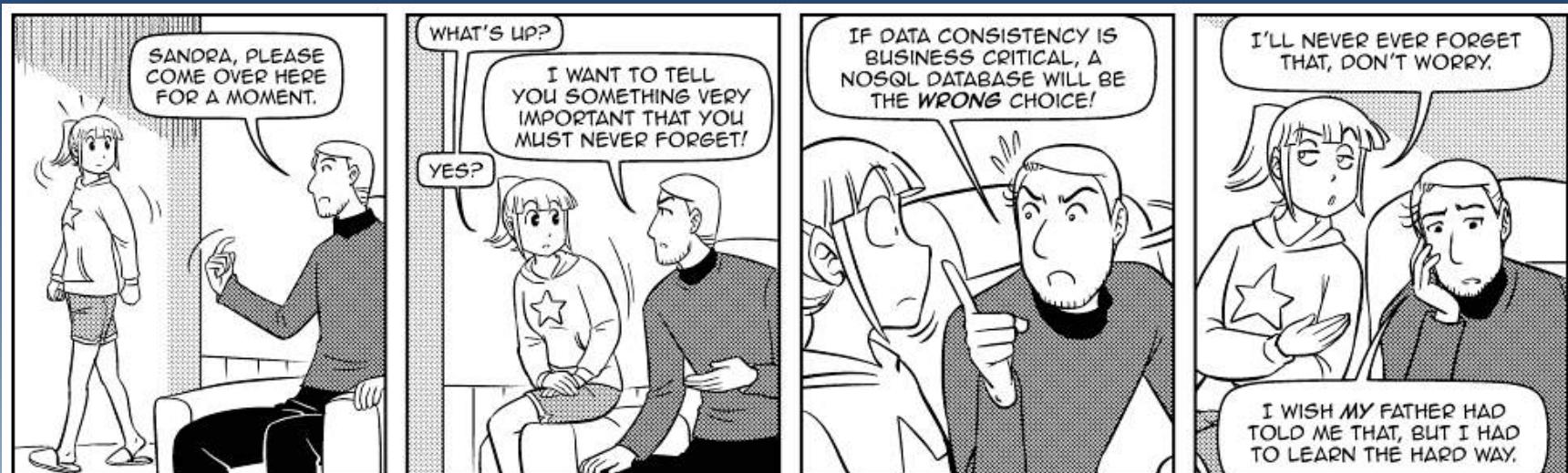
Source: After “Towards Robust Distributed Systems” Eric Brewer (2000)

# But ...



*... we find developers spend a significant fraction of their time building extremely complex and error-prone mechanisms to cope with eventual consistency and handle data that may be out of date. We think this is an unacceptable burden to place on developers and that consistency problems should be solved at the database level.*

# Use the right tool



Source: <http://www.sandraandwoo.com/2013/02/07/0453-cassandra/>

# Tuneable CAP

- Examples
  - Cassandra
  - MongoDB
  - Riak

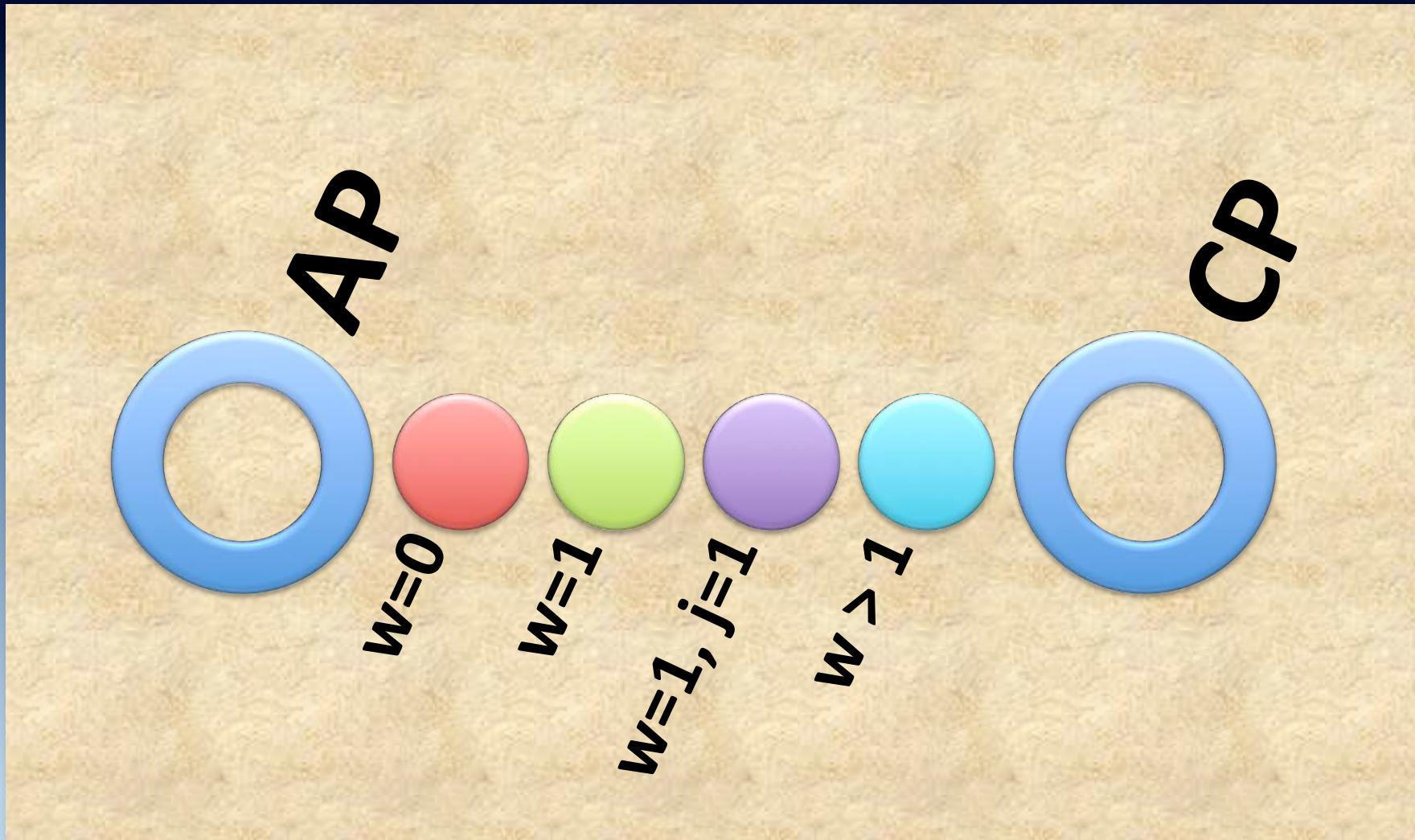


# MongoDB speed vs. safety

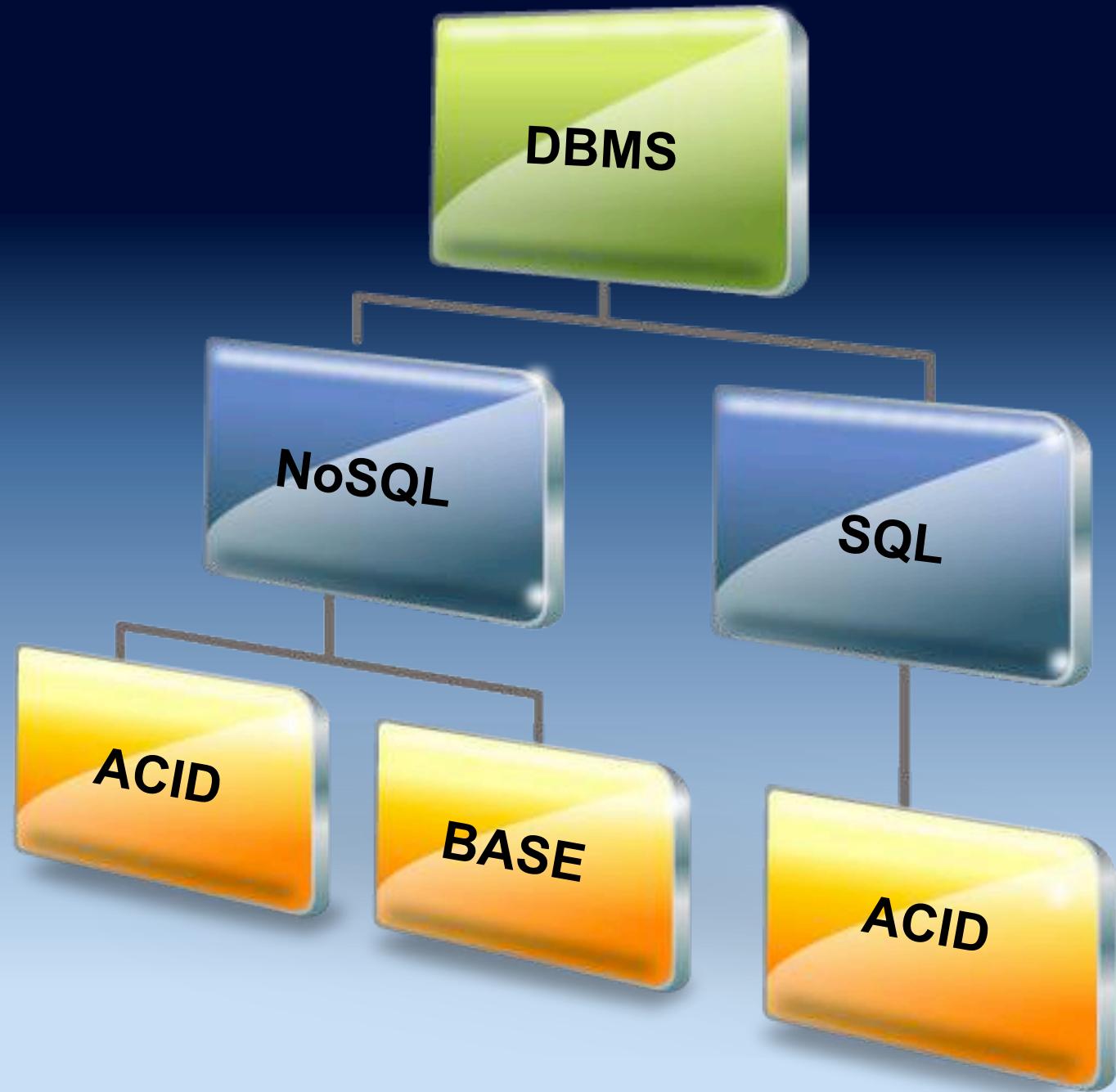
| Options         | WriteConcern         | Notes                                      |
|-----------------|----------------------|--|
| w=0, j=0        | UNACKNOWLEDGED       | Fire and Forget                            |
| w=1, j=0        | ACKNOWLEDGED         | Operation completed successfully in memory |
| w=1, j=1        | JOURNALED            | Operation written to the journal file      |
| w=1, fsync=true | FSYNCED              | Operation written to disk                  |
| w=2, j=0        | REPLICA_ACKNOWLEDGED | Ack by primary and at least one secondary  |
| w=majority, j=0 | MAJORITY             | Ack by the majority of nodes               |

Source: “MongoDB Replication” Philipp Krenn (30 November 2014)

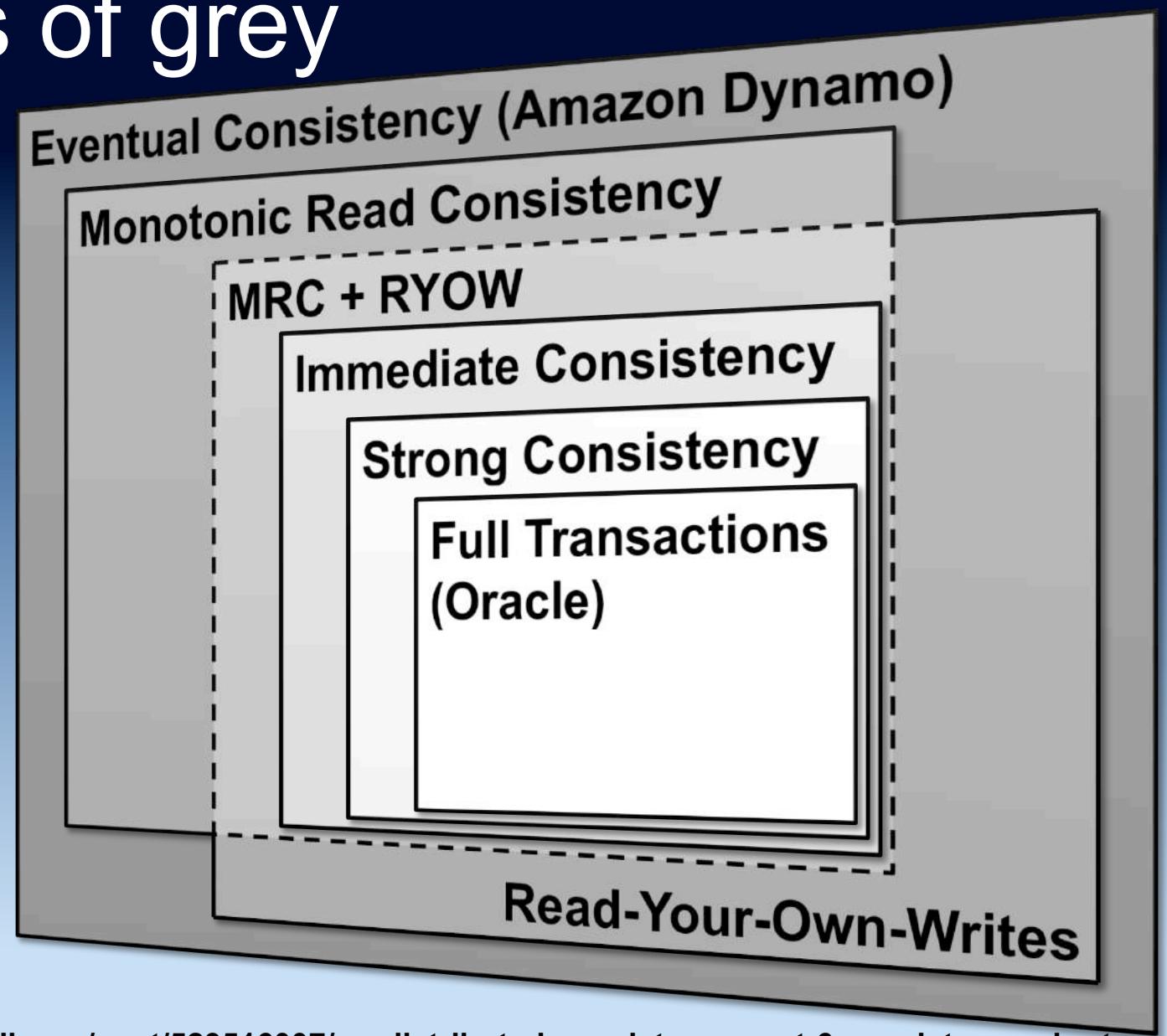
# MongoDB Replica Sets



Source: Adapted from “Don’t fight MongoDB” Mirko Bonadei (13 December 2013)

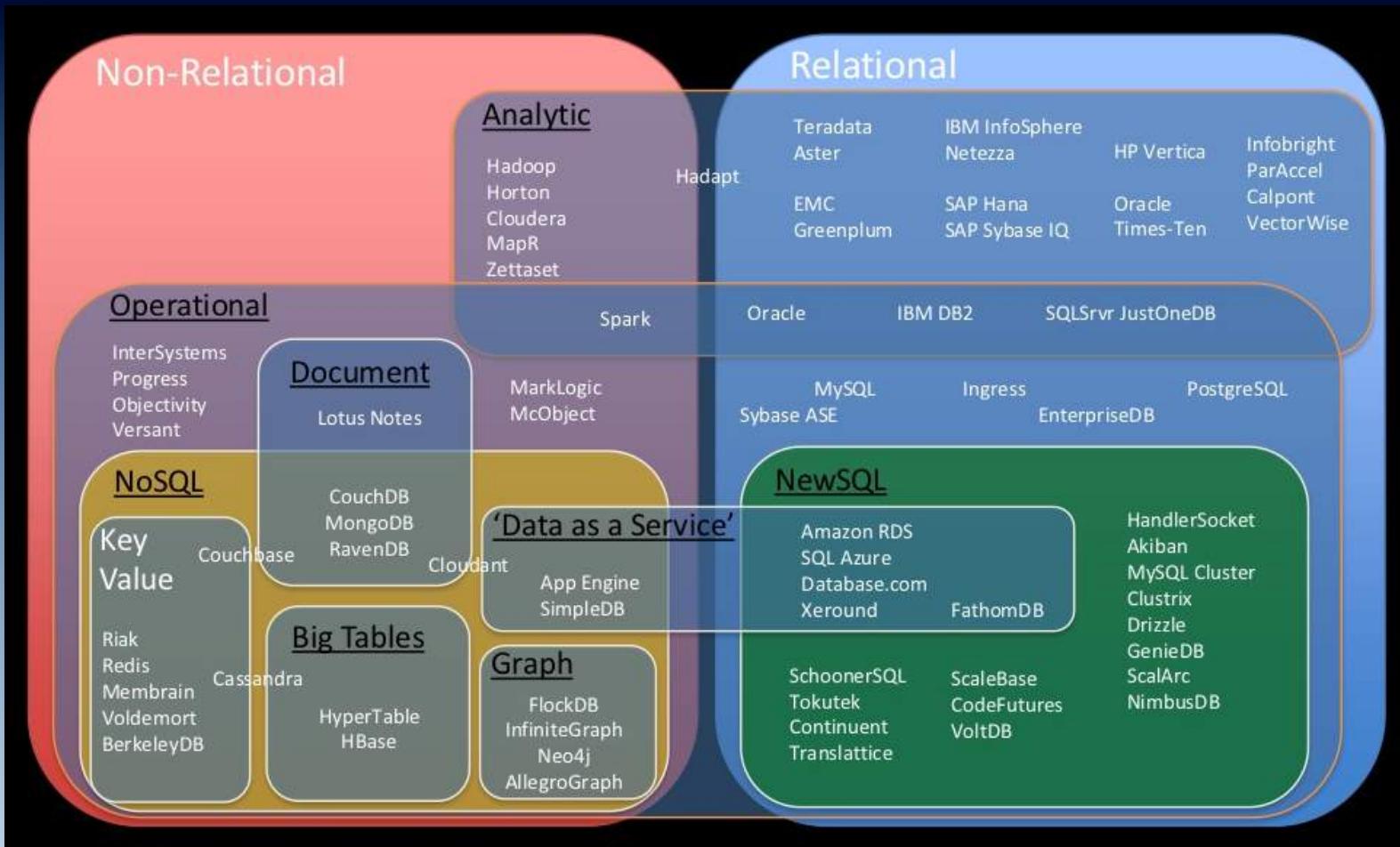


# Shades of grey



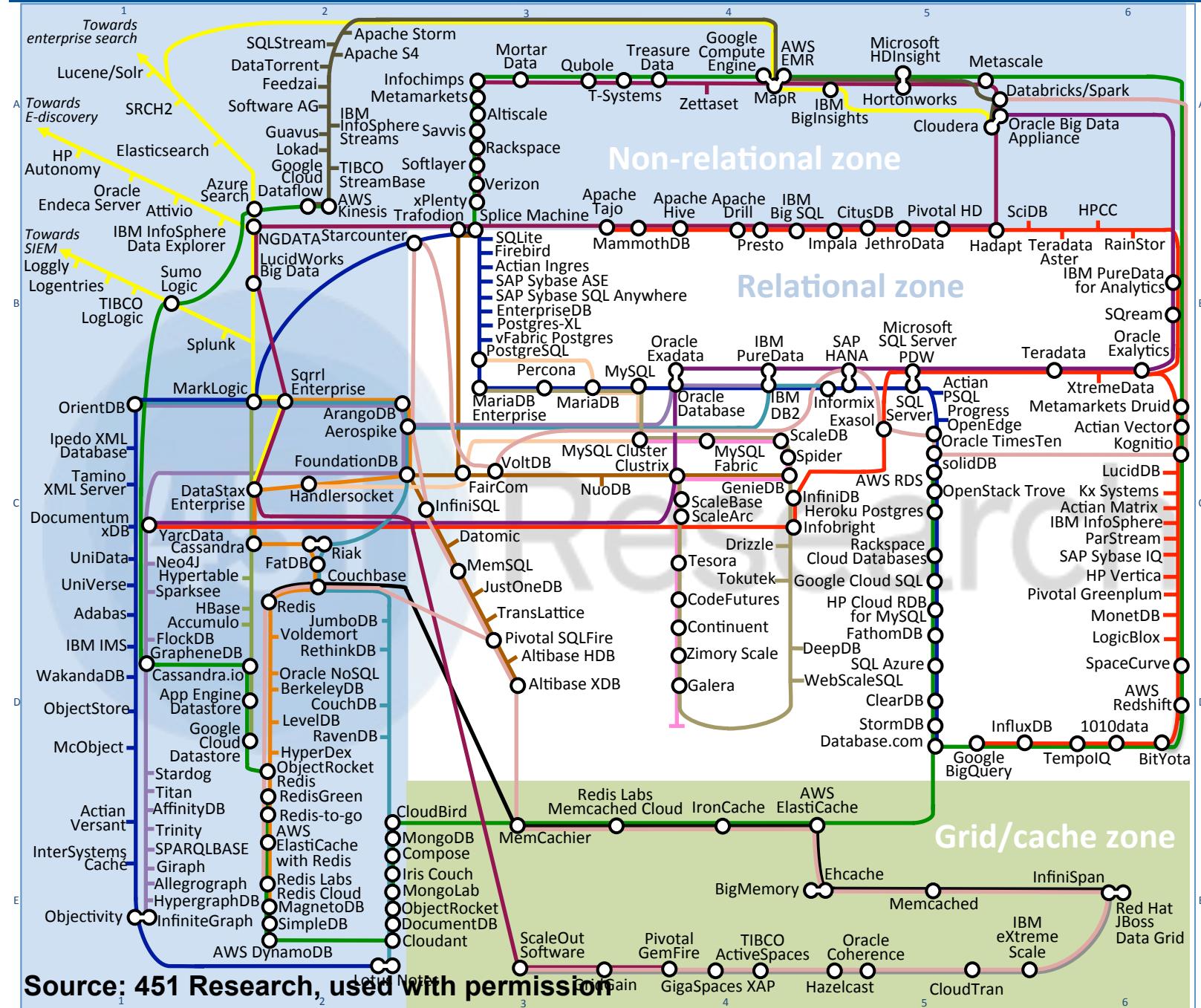
Source: <http://blog.mongodb.org/post/523516007/on-distributed-consistency-part-6-consistency-chart>

# Choices, choices



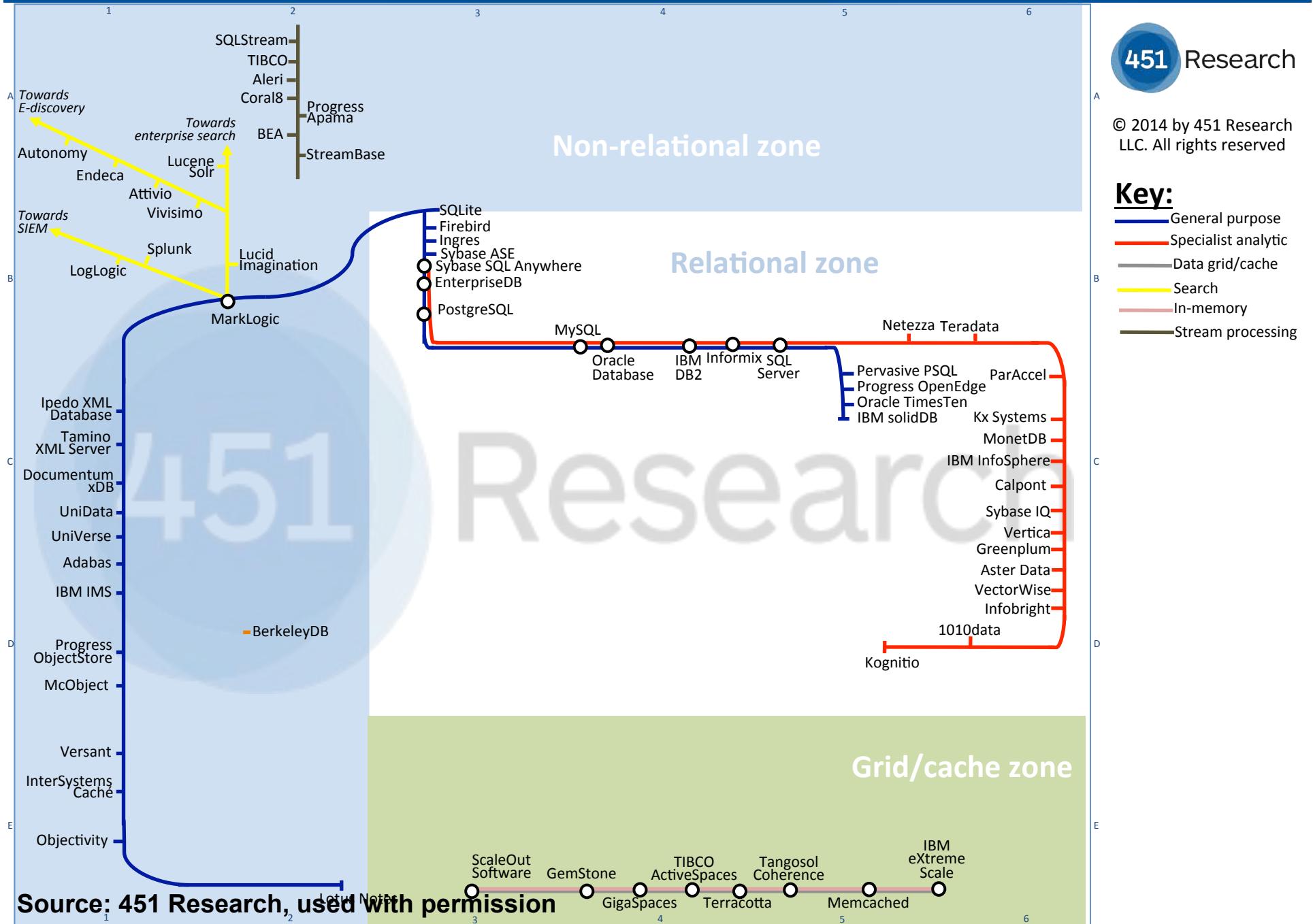
Source: Infochimps, used with permission

# 451 Research: Data Platforms Landscape Map – September 2014



© 2014 by 451 Research LLC. All rights reserved

# 451 Research: Data Platforms Landscape Map – ~2009



© 2014 by 451 Research LLC. All rights reserved

**Key:**

- General purpose
- Specialist analytic
- Data grid/cache
- Search
- In-memory
- Stream processing

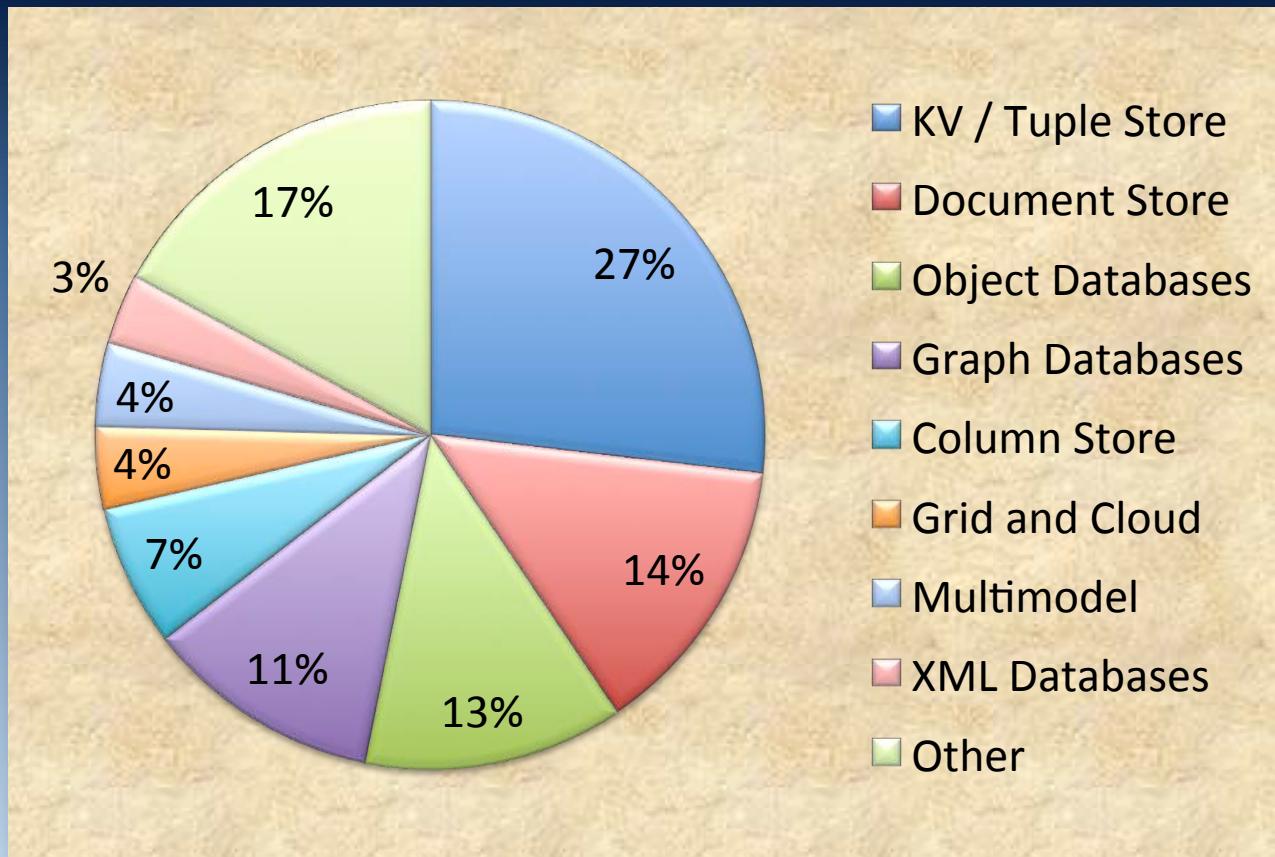
# How many systems? ...



*There are a lot of Key/Value stores and distributed schema-free Document Oriented Databases out there. They're springing up like weeds in a spring garden. And folks love to blog about them and/or talk about how their favorite is better than the others (or MySQL).*

-- Jeremy Zawodny

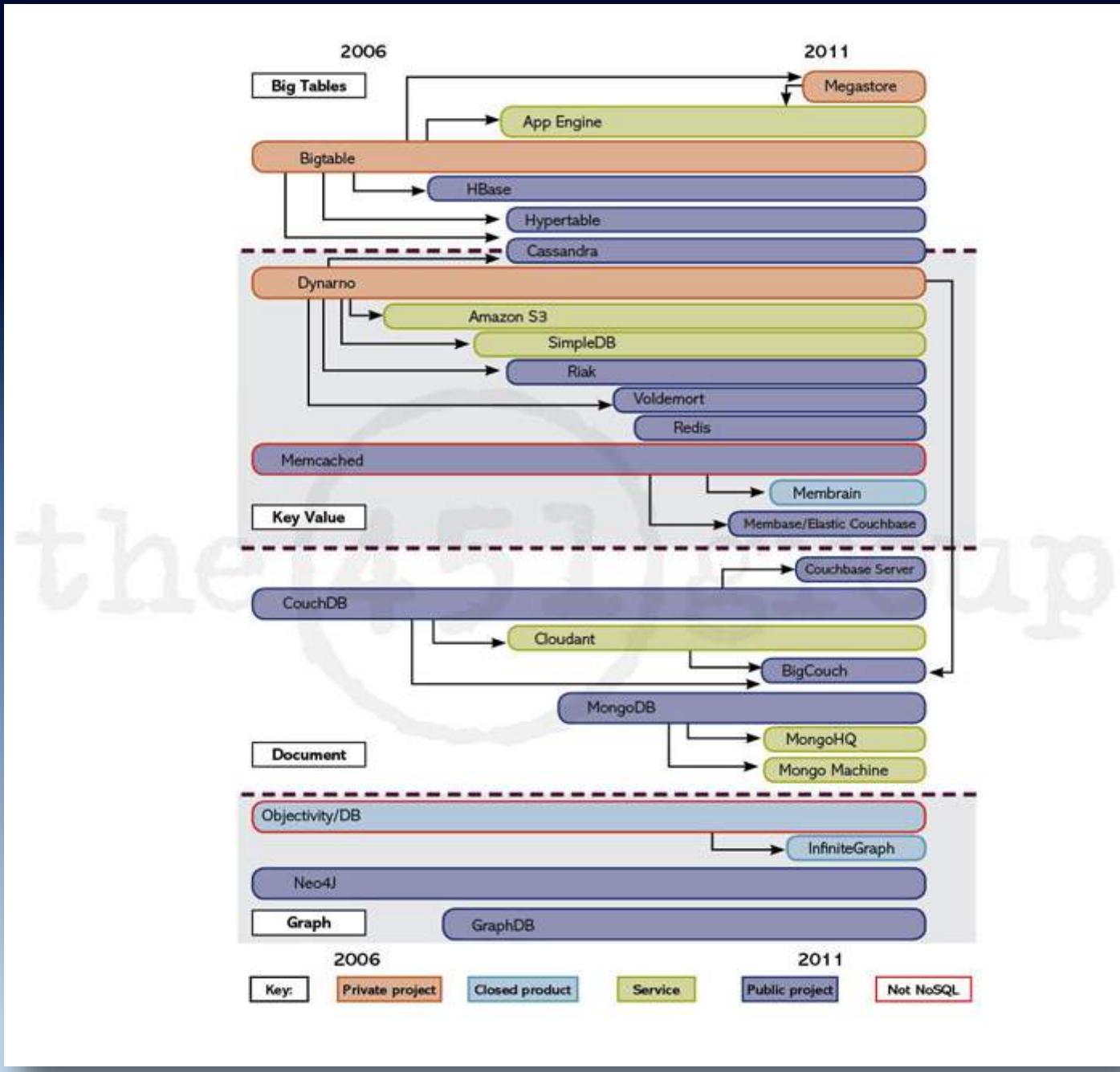
# How many systems?



Source: <http://nosql-database.org/> (24 March 2015)

# Major categories of NoSQL ...

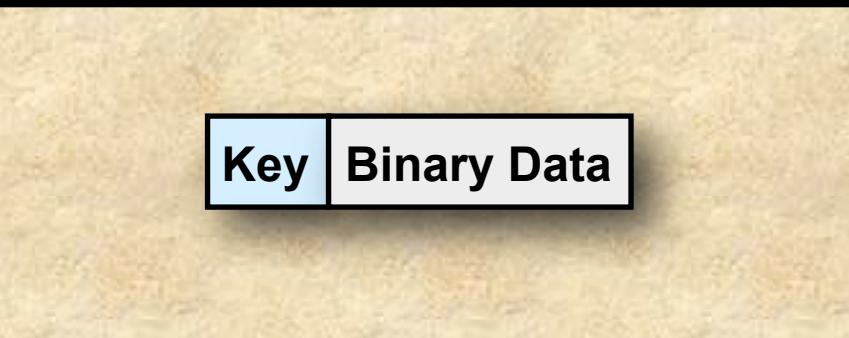
| Type            | Examples   |
|-----------------|--|
| Key-Value store |  redis  riak               |
| Column store    |  Cassandra  HBASE          |
| Document store  |  CouchDB relax  mongoDB |
| Graph store     |  InfiniteGraph  Neo4j  |



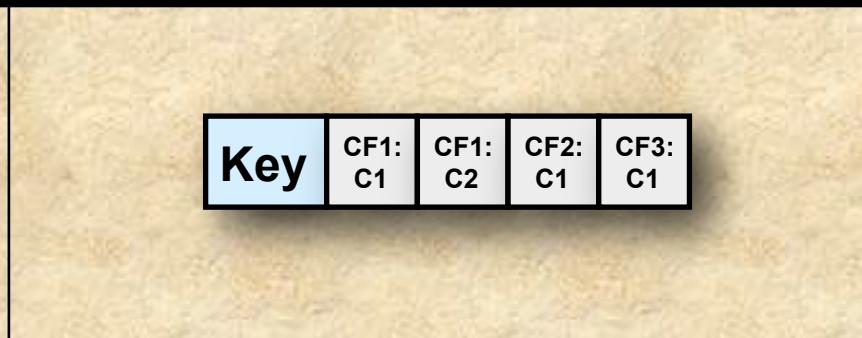
Source: 451 Research, used with permission

# Major categories of NoSQL

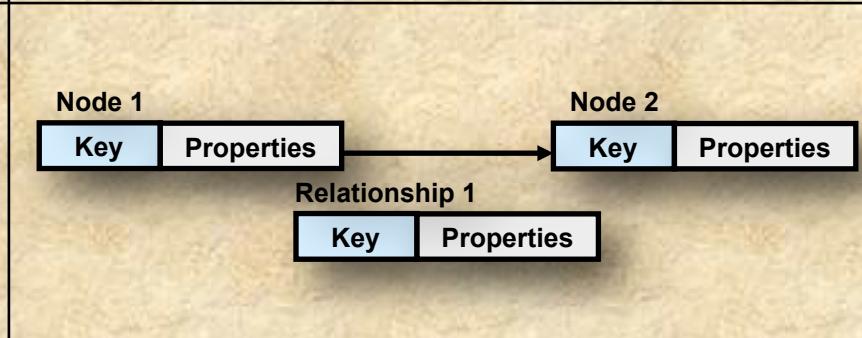
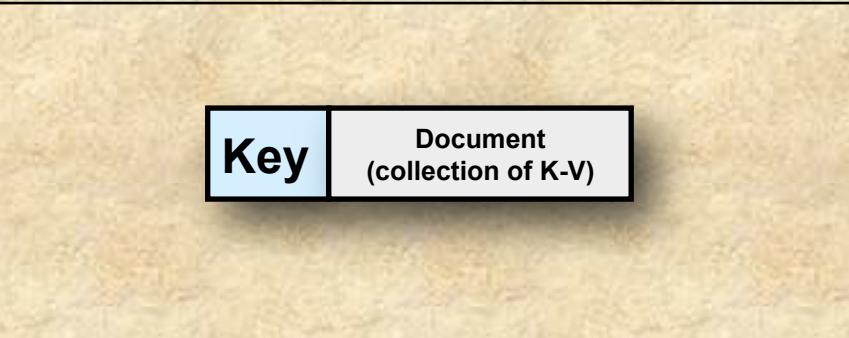
## Key-Value store



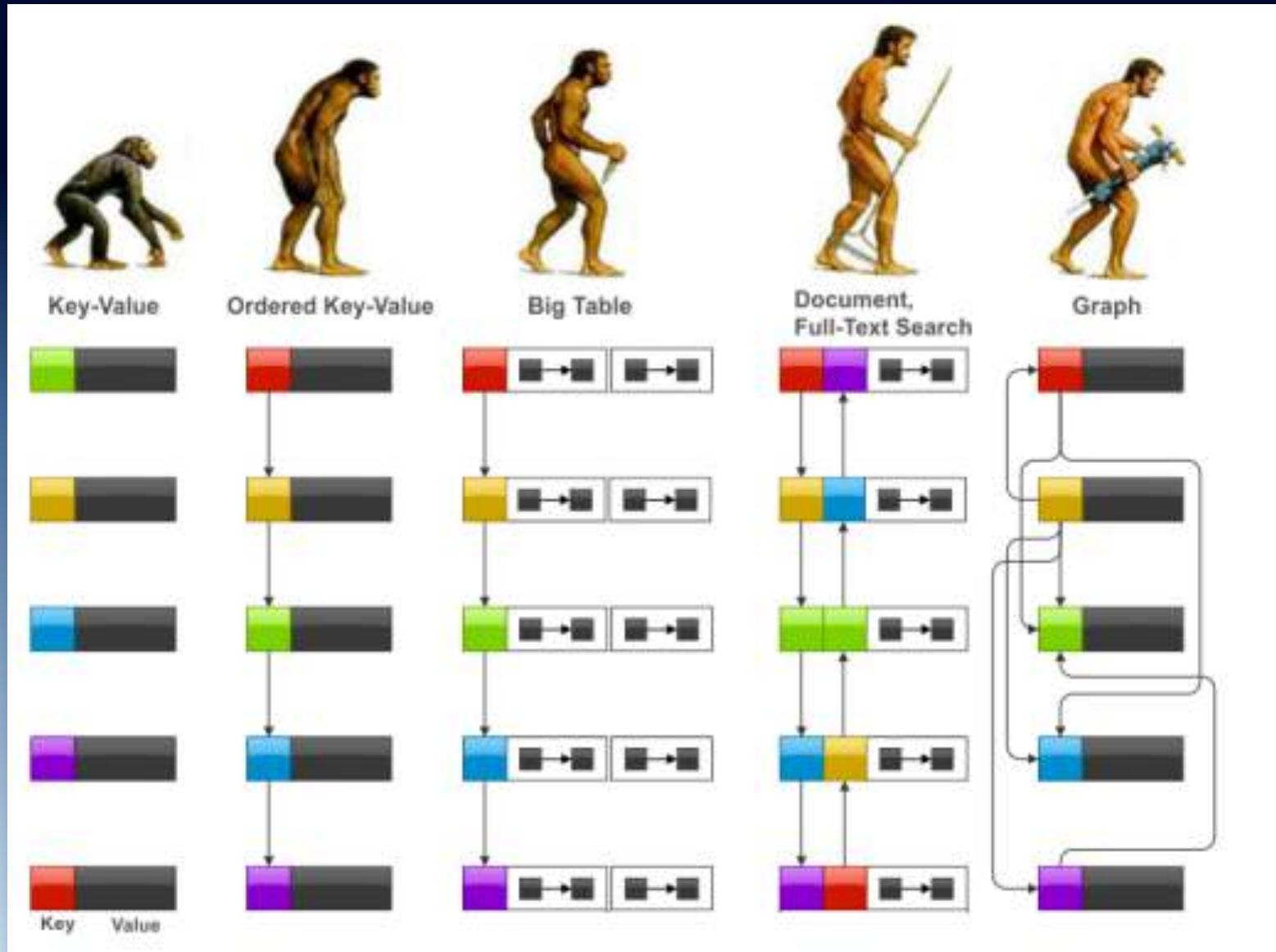
## Column store



## Document store

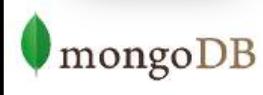


## Graph store



Source: Ilya Katsov, used with permission

# Popular NoSQL DBs

|   | License | Protocol     | API/Query   | Replication |
|---|---------|--------------|-------------|-------------|
|  Cassandra | Apache  | Thrift       | CQL, Thrift | P2P         |
|  CouchDB   | Apache  | REST/HTTP    | JSON, MR    | M-M         |
|  mongoDB  | AGPL    | Proprietary  | BSON        | M-S, Shard  |
|  redis   | BSD     | Telnet-Like* | Many Langs. | M-S         |
|  riak    | Apache  | REST/HTTP    | JSON, MR    | P2P*        |

Source: "Big Data Projects: How to Choose NoSQL Databases" Thomas Casselberry (21 January 2015)

# Analysis of replication consensus strategies

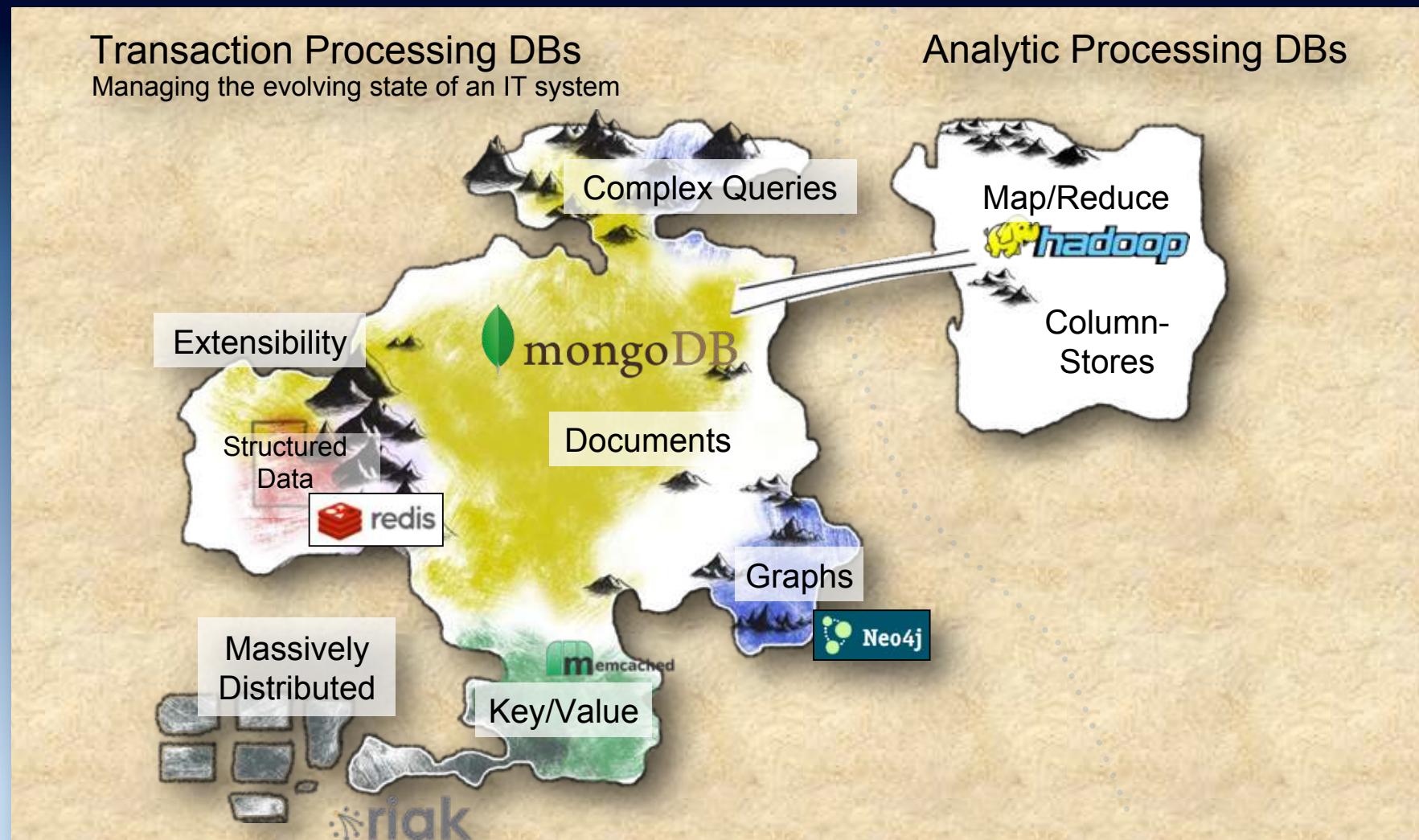
|              | Backups | M-S    | M-M      | 2PC  | Paxos  |
|--------------|---------|--------|----------|------|--------|
| Consistency  | Weak    |        | Eventual |      | Strong |
| Transactions | No      | Full   | Local    |      | Full   |
| Latency      |         | Low    |          | High |        |
| Throughput   |         | High   |          | Low  | Medium |
| Data Loss    | Lots    |        | Some     |      | None   |
| Failover     | Down    | R-only |          | R-W  |        |

Source: “The Road to Akka Cluster and Beyond” Jonas Bonér (3 December 2013)

# The rise of multi-model DBs ...

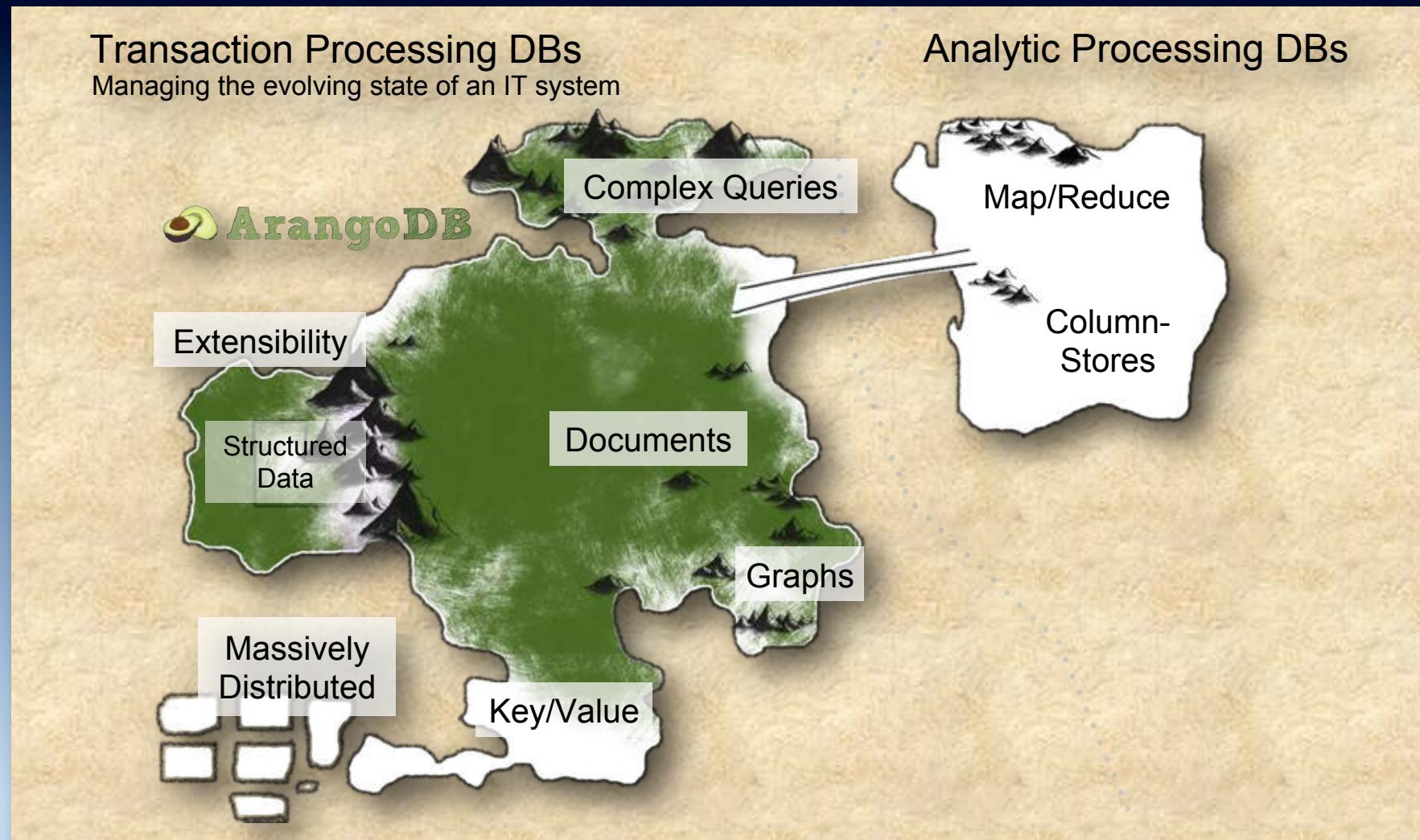
|   | K-V | Column | Document | Graph |
|---|-----|--------|----------|-------|
|  ArangoDB  | ✓   |        | ✓        | ✓     |
|  Cassandra | ✓   | ✓      |          | ✓*    |
|  Redis   | ✓   |        | ✓        |       |
|  riak    | ✓   |        | ✓        |       |

# The rise of multi-model DBs ...



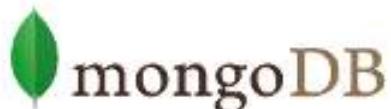
Source: ArangoDB, used with permission

# The rise of multi-model DBs

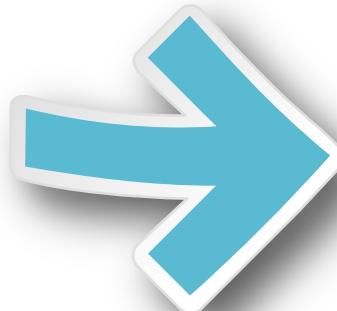


Source: ArangoDB, used with permission

# Commercialization examples



*Cassandra*



# Key-Value store

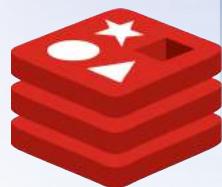
- Simplest NoSQL stores, provide low-latency writes but single key/value access
- Store data as a hash table of keys where every key maps to an opaque binary object
- Easily scale across many machines
- Use-cases: applications that require massive amounts of simple data (sensor, web operations), applications that require rapidly changing data (stock quotes), caching

# Redis and Riak examples

```
{  
    database number: {  
        "key 1": "value",  
        "key 2": [ "value", "value",  
        "value" ],  
        "key 3": [  
            { "value": "value", "score":  
            score },  
            { "value": "value", "score":  
            score },  
            ...  
        ],  
        "key 4": {  
            "property 1": "value",  
            "property 2": "value",  
            "property 3": "value", ...  
        }, ...  
    }  
}  
  
{  
    "bucket 1": {  
        "key 1": document + content-type,  
        "key 2": document + content-type,  
        "link to another object 1": URI of  
        other bucket/key,  
        "link to another object 2": URI of  
        other bucket/key,  
    },  
    "bucket 2": {  
        "key 3": document + content-type,  
        "key 4": document + content-type,  
        "key 5": document + content-type  
        ...  
    }, ...  
}
```

# DEMO

## DEMO



redis

# Connection

```
Jedis j = new Jedis("localhost", 6379);  
j.connect();  
  
System.out.println("Connected to Redis");
```

# Create

```
String id = Long.toString(j.incr("global:nextUserId"));

j.set("uid:" + id + ":name", "akmal");
j.set("uid:" + id + ":age", "40");
j.set("uid:" + id + ":date", new Date().toString());
j.sadd("uid:" + id + ":likes", "satay");
j.sadd("uid:" + id + ":likes", "kebabs");
j.sadd("uid:" + id + ":likes", "fish-n-chips");

j.hset("uid:lookup:name", "akmal", id);
```

# Read

```
String id = j.hget("uid:lookup:name", "akmal");

print("name ", j.get("uid:" + id + ":name"));
print("age ", j.get("uid:" + id + ":age"));
print("date ", j.get("uid:" + id + ":date"));
print("likes ", j.smembers("uid:" + id + ":likes"));
```

# Update

```
String id = j.hget("uid:lookup:name", "akmal");  
  
j.set("uid:" + id + ":age", "29");
```

# Delete

```
String id = j.hget("uid:lookup:name", "akmal");

j.del("uid:" + id + ":name");
j.del("uid:" + id + ":age");
j.del("uid:" + id + ":date");
j.del("uid:" + id + ":likes");
```

# Column store ...

- Manage structured data, with multiple-attribute access
- Columns are grouped together in “column-families/groups”; each storage block contains data from only one column/column set to provide data locality for “hot” columns
- Column groups defined *a priori*, but support variable schemas within a column group

# Column store

- Scale using replication, multi-node distribution for high availability and easy failover
- Optimized for writes
- Use cases: high throughput verticals (activity feeds, message queues), caching, web operations

# Cassandra example

```
{  
  "column family 1": {  
    "key 1": {  
      "property 1": "value",  
      "property 2": "value"  
    },  
    "key 2": {  
      "property 1": "value",  
      "property 4": "value",  
      "property 5": "value"  
    },  
  }, ...  
}  
  
{  
  "column family 2": {  
    "super key 1": {  
      "key 1": {  
        "property 1": "value",  
        "property 2": "value"  
      },  
      "key 2": {  
        "property 1": "value",  
        "property 4": "value",  
        "property 5": "value"  
      }, ...  
    }, ...  
  }, ...  
}
```

# DEMO

# DEMO



# Connection

```
Class.forName("org.apache.cassandra.cql.jdbc.CassandraDriver");
connection = DriverManager.getConnection(
    "jdbc:cassandra://localhost:9160/demodb");

System.out.println("Connected to Cassandra");
```

# Create

```
String query =  
"BEGIN BATCH\n" +  
"INSERT INTO people (name, age, date, likes) VALUES ('akmal', 40, ""  
+ new Date() +  
", {'satay', 'kebabs', 'fish-n-chips'})\n" +  
"APPLY BATCH;";
```

```
Statement statement = connection.createStatement();  
statement.executeUpdate(query);  
statement.close();
```

# Read

```
String query = "SELECT * FROM people";  
  
Statement statement = connection.createStatement();  
ResultSet cursor = statement.executeQuery(query);  
  
while (cursor.next())  
    for (int j = 1; j < cursor.getMetaData().getColumnCount() + 1; j++)  
        System.out.printf("%-10s: %s%n",  
                         cursor.getMetaData().getColumnName(j),  
                         cursor.getString(cursor.getMetaData().getColumnName(j)));  
  
cursor.close();  
statement.close();
```

# Update

```
String query =  
    "UPDATE people SET age = 29 WHERE name = 'akmal"';
```

```
Statement statement = connection.createStatement();  
statement.executeUpdate(query);  
statement.close();
```

# Delete

```
String query =  
"BEGIN BATCH\n" +  
"DELETE FROM people WHERE name = 'akmal'\n" +  
"APPLY BATCH;";
```

```
Statement statement = connection.createStatement();  
statement.executeUpdate(query);  
statement.close();
```

# Document store

- Represent rich, hierarchical data structures, reducing the need for multi-table joins
- Structure of the documents need not be known *a priori*, can be variable, and evolve instantly, but a query can understand the contents of a document
- Use cases: rapid ingest and delivery for evolving schemas and web-based objects

# MongoDB example

```
{  
  "namespace 1": any json object,  
  "namespace 2": any json object,  
  ...  
}  
  
{  
  "namespace 1": [  
    {  
      "_id": "key 1",  
      "property 1": "value",  
      "property 2": {  
        "property 3": "value",  
        "property 4": [ "value",  
          "value", "value" ]  
      }, ...  
    },  
    ...  
  ]  
}
```

# DEMO



# Connection

```
private static final String DBNAME = "demodb";
private static final String COLLNAME = "people";
...
MongoClient mongoClient = new MongoClient("localhost", 27017);
DB db = mongoClient.getDB(DBNAME);
DBCollection collection = db.getCollection(COLLNAME);

System.out.println("Connected to MongoDB");
```

# Create

```
BasicDBObject document = new BasicDBObject();
```

```
List<String> likes = new ArrayList<String>();
```

```
likes.add("satay");
```

```
likes.add("kebabs");
```

```
likes.add("fish-n-chips");
```

```
document.put("name", "akmal");
```

```
document.put("age", 40);
```

```
document.put("date", new Date());
```

```
document.put("likes", likes);
```

```
collection.insert(document);
```

# Read

```
BasicDBObject document = new BasicDBObject();
document.put("name", "akmal");
```

```
DBCursor cursor = collection.find(document);
```

```
while (cursor.hasNext())
    System.out.println(cursor.next());
```

```
cursor.close();
```

# Update

```
BasicDBObject document = new BasicDBObject();
document.put("name", "akmal");
```

```
BasicDBObject newDocument = new BasicDBObject();
newDocument.put("age", 29);
```

```
BasicDBObject updateObj = new BasicDBObject();
updateObj.put("$set", newDocument);
```

```
collection.update(document, updateObj);
```

# Delete

```
BasicDBObject document = new BasicDBObject();
document.put("name", "akmal");

collection.remove(document);
```

# DEMO



mongoDB



TM

# Connection

```
var async = require('async');
var MongoClient = require('mongodb').MongoClient;
MongoClient.connect("mongodb://localhost:27017/demodb",
function(err, db) {
  if (err) {
    return console.log(err);
  }
  console.log("Connected to MongoDB");
  var collection = db.collection('people');
  var document = {
    'name':'akmal',
    'age':40,
    'date':new Date(),
    'likes':['satay', 'kebabs', 'fish-n-chips']
  };
}
```

# Create

```
function (callback) {  
    collection.insert(document, {w:1}, function(err, result) {  
        if (err) {  
            return callback(err);  
        }  
        callback();  
    });  
},
```

# Read

```
function (callback) {  
    collection.findOne({name:'akmal'}, function(err, item) {  
        if (err) {  
            return callback(err);  
        }  
        console.log(item);  
        callback();  
    });  
},
```

# Update

```
function (callback) {  
    collection.update({name:'akmal'}, {$set:{age:29}}, {w:1},  
    function(err, result) {  
        if (err) {  
            return callback(err);  
        }  
        callback();  
    });  
},
```

# Delete

```
function (callback) {  
    collection.remove({'name':'akmal'}, function(err, result) {  
        if (err) {  
            return callback(err);  
        }  
        callback();  
    });  
},
```

# Graph store

- Use nodes, relationships between nodes, and key-value properties
- Access data using graph traversal, navigating from start nodes to related nodes according to graph algorithms
- Faster for associative data sets
- Use cases: storing and reasoning on complex and connected data, such as inferencing applications in healthcare, government, telecom, oil, performing closure on social networking graphs



## LinkedIn Maps

Akmal Chaudhri's Professional Network

as of April 22, 2014



# DEMO



**Neo4j**  
the graph database

# Connection

```
private static final String DB_PATH =
"C:/neo4j-community-1.8.2/data/graph.db";

private static enum RelTypes implements RelationshipType {
    LIKES
}
...
graphDb =
    new GraphDatabaseFactory().newEmbeddedDatabase(DB_PATH);
registerShutdownHook(graphDb);

System.out.println("Connected to Neo4j");
```

# Create

```
Transaction tx = graphDb.beginTx();

try {
    firstNode = graphDb.createNode();
    firstNode.setProperty("name", "akmal");
    firstNode.setProperty("age", 40);
    firstNode.setProperty("date", new Date().toString());
    secondNode = graphDb.createNode();
    secondNode.setProperty("food", "satay, kebabs, fish-n-chips");
    relationship = firstNode.createRelationshipTo(secondNode,
        RelTypes.LIKES);
    relationship.setProperty("likes", "likes");
    tx.success();
} finally { tx.finish(); }
```

# Read

```
Transaction tx = graphDb.beginTx();

try {
    print("name", firstNode.getProperty("name"));
    print("age", firstNode.getProperty("age"));
    print("date", firstNode.getProperty("date"));
    print("likes", secondNode.getProperty("food"));
    tx.success();
} finally { tx.finish(); }
```

# Update

```
Transaction tx = graphDb.beginTx();
```

```
try {  
    firstNode.setProperty("age", 29);  
    tx.success();  
} finally { tx.finish(); }
```

# Delete

```
Transaction tx = graphDb.beginTx();

try {
    firstNode.getSingleRelationship(RelTypes.LIKES,
        Direction.OUTGOING).delete();
    firstNode.delete();
    secondNode.delete();
    tx.success();
} finally { tx.finish(); }
```

# NoSQL use cases ...

- Online/mobile gaming
  - Leaderboard (high score table) management
  - Dynamic placement of visual elements
  - Game object management
  - Persisting game/user state information
  - Persisting user generated data (e.g. drawings)
- Display advertising on web sites
  - Ad Serving: match content with profile and present
  - Real-time bidding: match cookie profile with advert inventory, obtain bids, and present advert

# NoSQL use cases

- Dynamic content management and publishing (news and media)
  - Store content from distributed authors, with fast retrieval and placement
  - Manage changing layouts and user generated content
- E-commerce/social commerce
  - Storing frequently changing product catalogs
- Social networking/online communities
- Communications
  - Device provisioning

# Use case requirements ...

- Schema flexibility and development agility
  - Application not constrained by fixed pre-defined schema
  - Application drives the schema
  - Ability to develop a minimal application rapidly, and iterate quickly in response to customer feedback
  - Ability to quickly add, change or delete “fields” or data-elements
  - Ability to handle mix of structured, unstructured data
  - Easier, faster programming, so faster time to market and quick to adapt

# Use case requirements ...

- Consistent low latency, even under high load
  - Typically milliseconds or sub-milliseconds, for reads and writes
  - Even with millions of users
- Dynamic elasticity
  - Rapid horizontal scalability
  - Ability to add or delete nodes dynamically
  - Application transparent elasticity, such as automatic (re)distribution of data, if needed
  - Cloud compatibility

# Use case requirements

- High availability
  - 24 x 7 x 365 availability
  - (Today) Requires data distribution and replication
  - Ability to upgrade hardware or software without any down time
- Low cost
  - Commonly available hardware
  - Lower cost software, such as open source or pay-per-use in cloud
  - Reduced need for database admin and maintenance

# Security and vulnerability



# Security



Source: Shutterstock Image ID 134699780

# NoSQL databases threat model

1. Transactional integrity
2. Lax authentication mechanisms
3. Inefficient authorization mechanisms
4. Susceptibility to injection attacks
5. Lack of consistency
6. Insider attacks

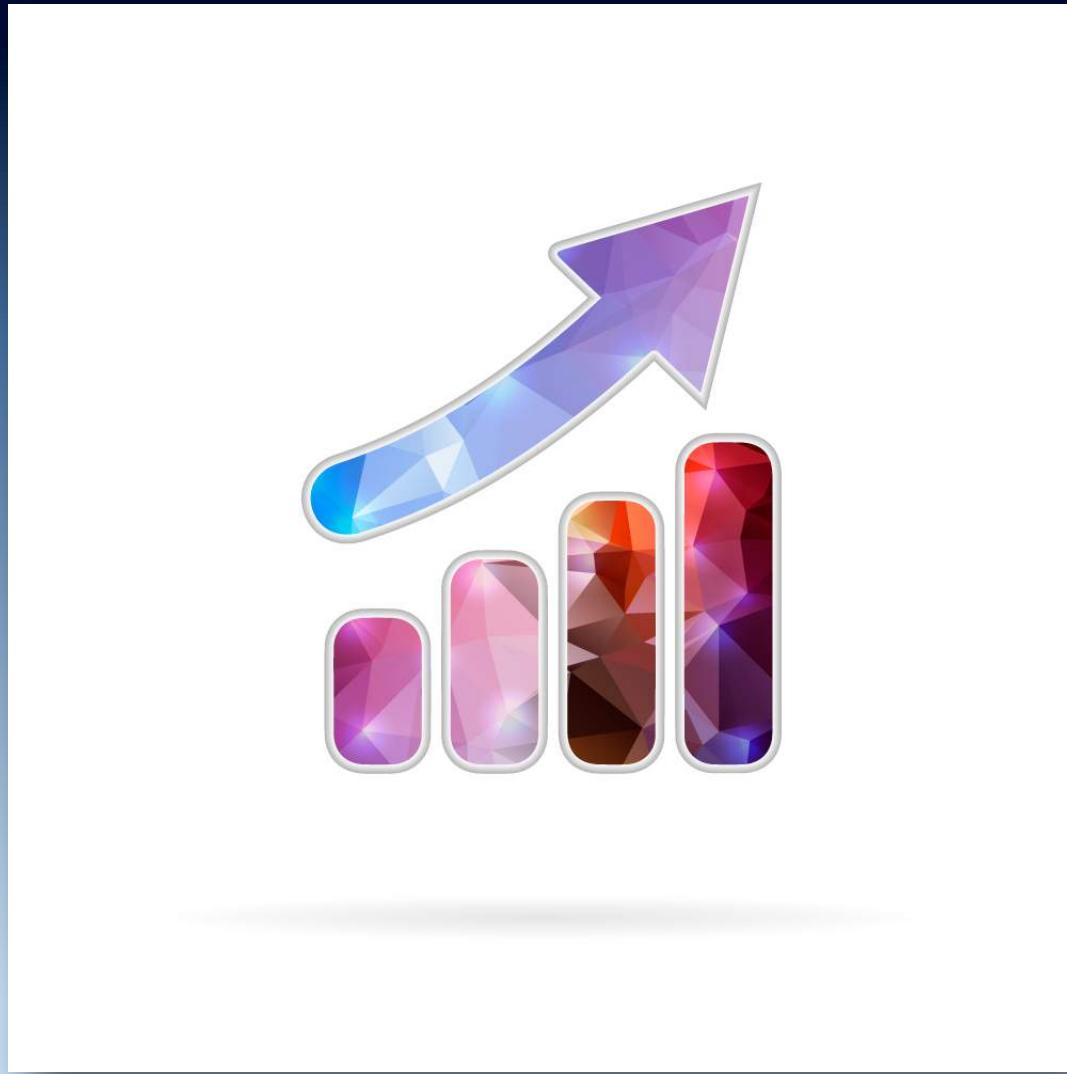
# NoSQL data security issues

1. Data at rest
2. Data in motion (client-node communications)
3. Data in motion (inter-node communications)
4. Authentication
5. Authorization
6. Audit
7. Data consistency
8. NoSQL injection exploits

# 5 Big Data security pitfalls

1. Running databases in a “trusted” environment
2. Loose access control
3. Static protection schemes
4. Inadequate solutions for detecting sensitive data
5. Lack of entitlement, auditing and monitoring

# Security problems increasing



Source: Shutterstock Image ID 216333160

# Well-known ports

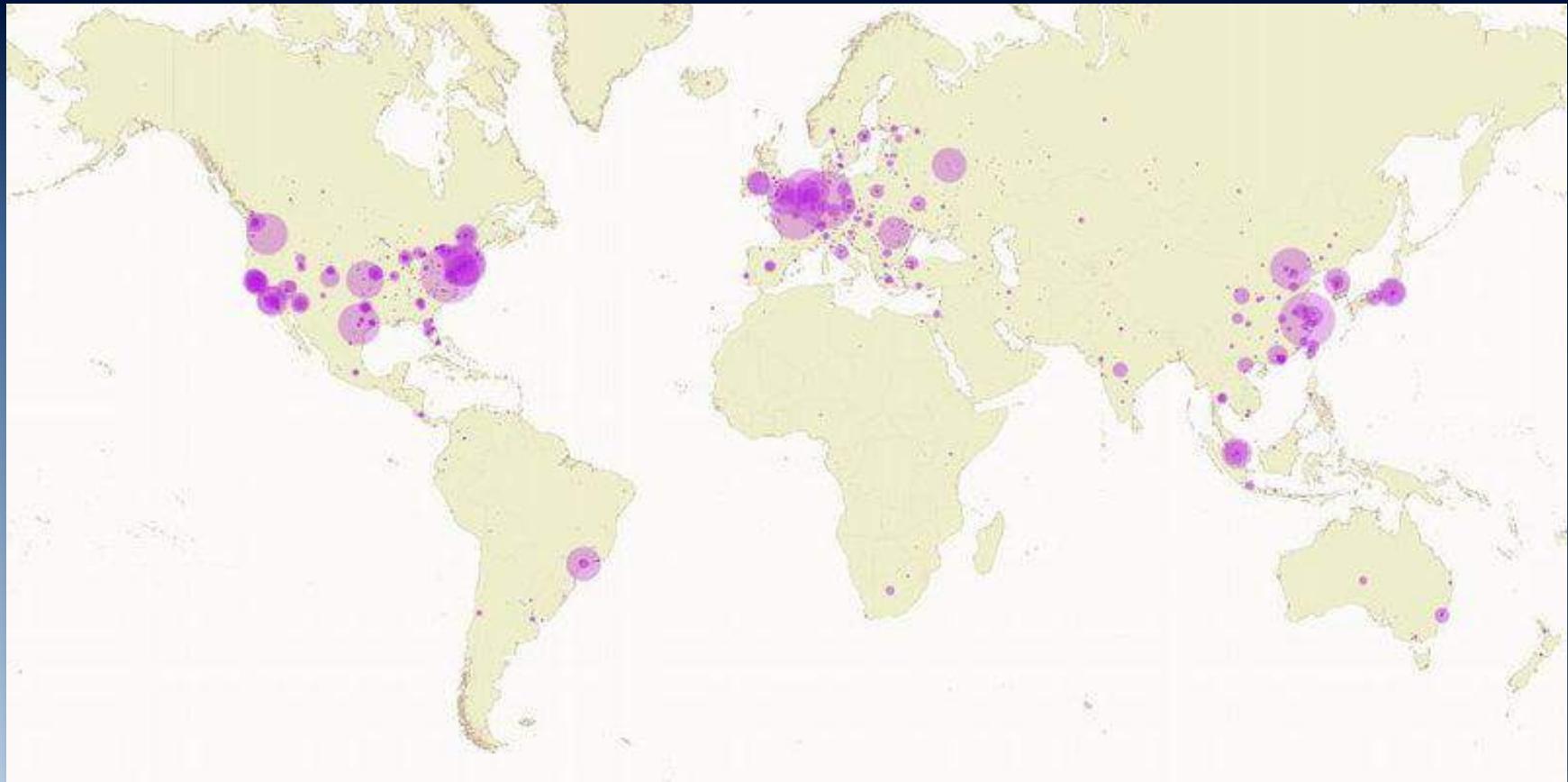
| Product   | Ports               |
|-----------|---------------------|
| MongoDB   | 27017, 28017, 27080 |
| CouchDB   | 5984                |
| HBase     | 9000                |
| Cassandra | 9160                |
| Neo4j     | 7474                |
| Redis     | 6379                |
| Riak      | 8098                |

Source: “Abusing NoSQL Databases” Ming Chow (2013)

# Shodan port example



# ~40,000 MongoDB open online



Source: “MongoDB databases at risk” Jens Heyens, Kai Greshake and Eric Petryka (January 2015)

# MongoDB leaking data

| Product | Instances | Size (TB) |
|---------|-----------|-----------|
| MongoDB | 29,980    | 595.2     |



Source: "It's the Data, Stupid!" John Matherly (18 July 2015)

# NoSQL apps leaking data ...

| Product       | Instances | Size (TB)   |
|---------------|-----------|-------------|
| Redis         | 35,330    | 13.21-17.08 |
| MongoDB       | 39,134    | 619.80      |
| Memcached     | 118,574   | 11.35       |
| ElasticSearch | 8990      | 531.20      |



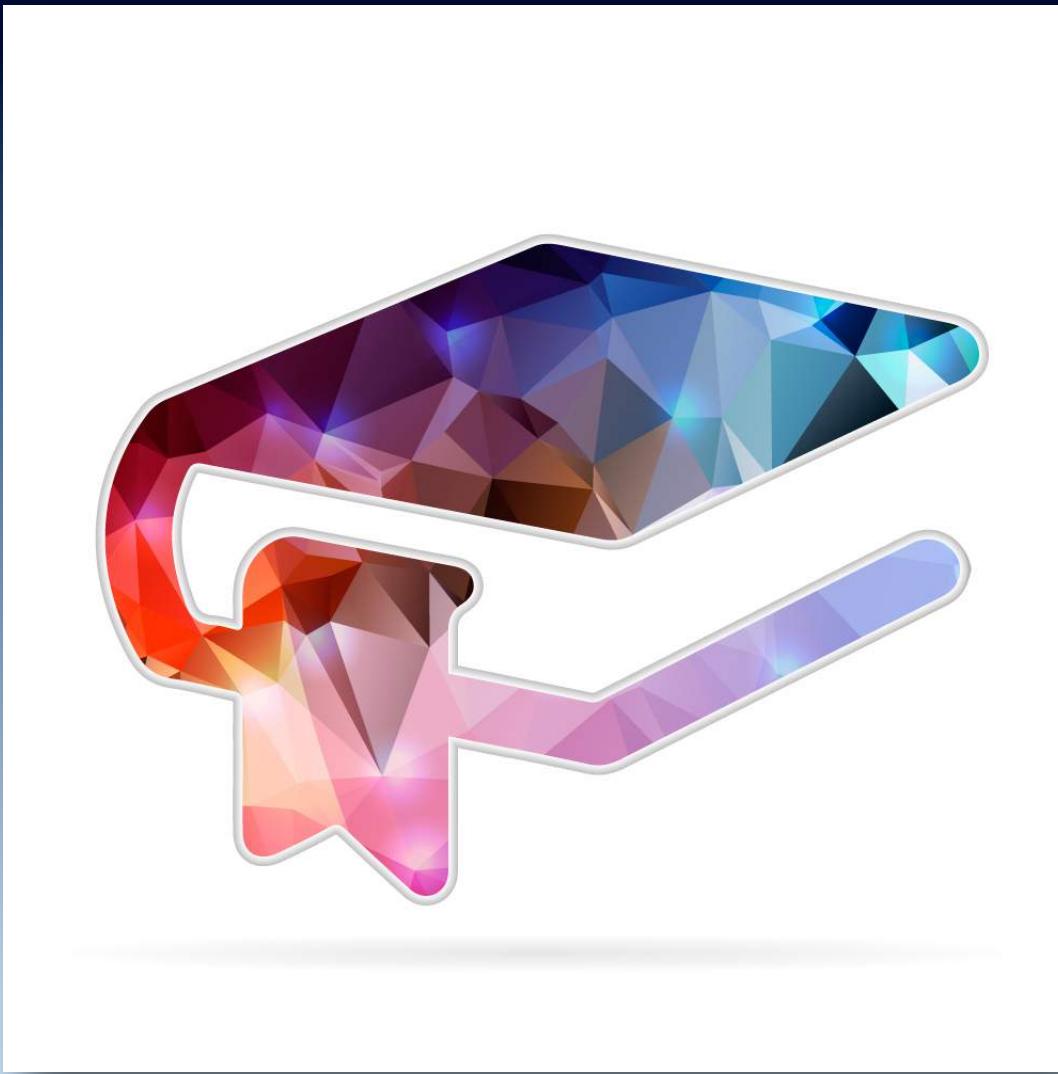
Source: "Data, Technologies and Security - Part 1" BinaryEdge (14 August 2015)

# NoSQL apps leaking data



*These technologies' default settings tend to have no configuration for authentication, encryption, authorization or any other type of security controls that we take for granted. Some of them don't even have a built-in access control.*

# Read the manual



Source: Shutterstock Image ID 196307192

# Redis security



*Redis is designed to be accessed by trusted clients inside trusted environments. This means that usually it is not a good idea to expose the Redis instance directly to the internet or, in general, to an environment where untrusted clients can directly access the Redis TCP port or UNIX socket.*

# MongoDB security



*The most effective way to reduce risk for MongoDB deployments is to run your entire MongoDB deployment, including all MongoDB components (i.e. mongod, mongos and application instances) in a trusted environment.*

# Memcached security



*Memcached has no security or authentication. Please ensure that your server is appropriately firewalled, and that the port(s) used for memcached servers are not publicly accessible. Otherwise, anyone on the internet can put data into and read data from your cache.*

# CouchDB security



*When you start out fresh, CouchDB allows any request to be made by anyone ... While it is incredibly easy to get started with CouchDB that way, it should be obvious that putting a default installation into the wild is adventurous. Any rogue client could come along and delete a database. **relax***

# NoSQL injection attacks ...

- NoSQL systems are vulnerable
- Various types of attacks
- Understand the vulnerabilities and consequences



# NoSQL injection attacks

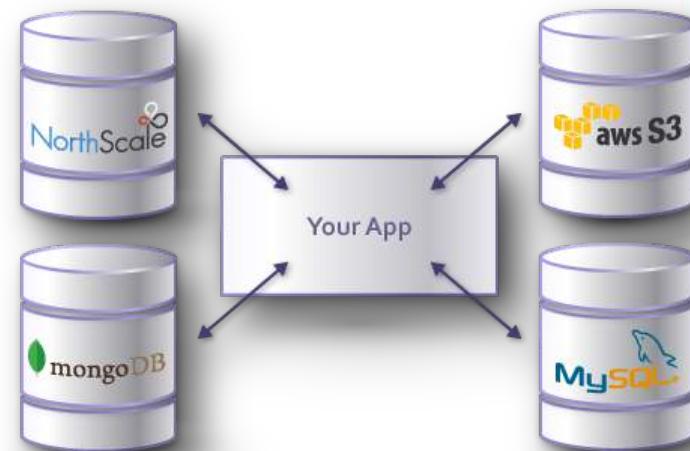
- Popular NoSQL products will attract more interest and scrutiny
- Features of some programming languages, e.g. PHP
- Server-Side JavaScript (SSJS)



# NoSQL injection testing

- NoSQLMap project
  - Open source proof-of-concept Python tool
  - Automates injection attacks
  - Exploits MongoDB vulnerabilities
  - Future support for other NoSQL databases

# Polyglot persistence



Source: Heroku, used with permission

# Polyglot persistence



Source: Adapted from “Polyglot Persistence” Martin Fowler (16 November 2011)

# But ...



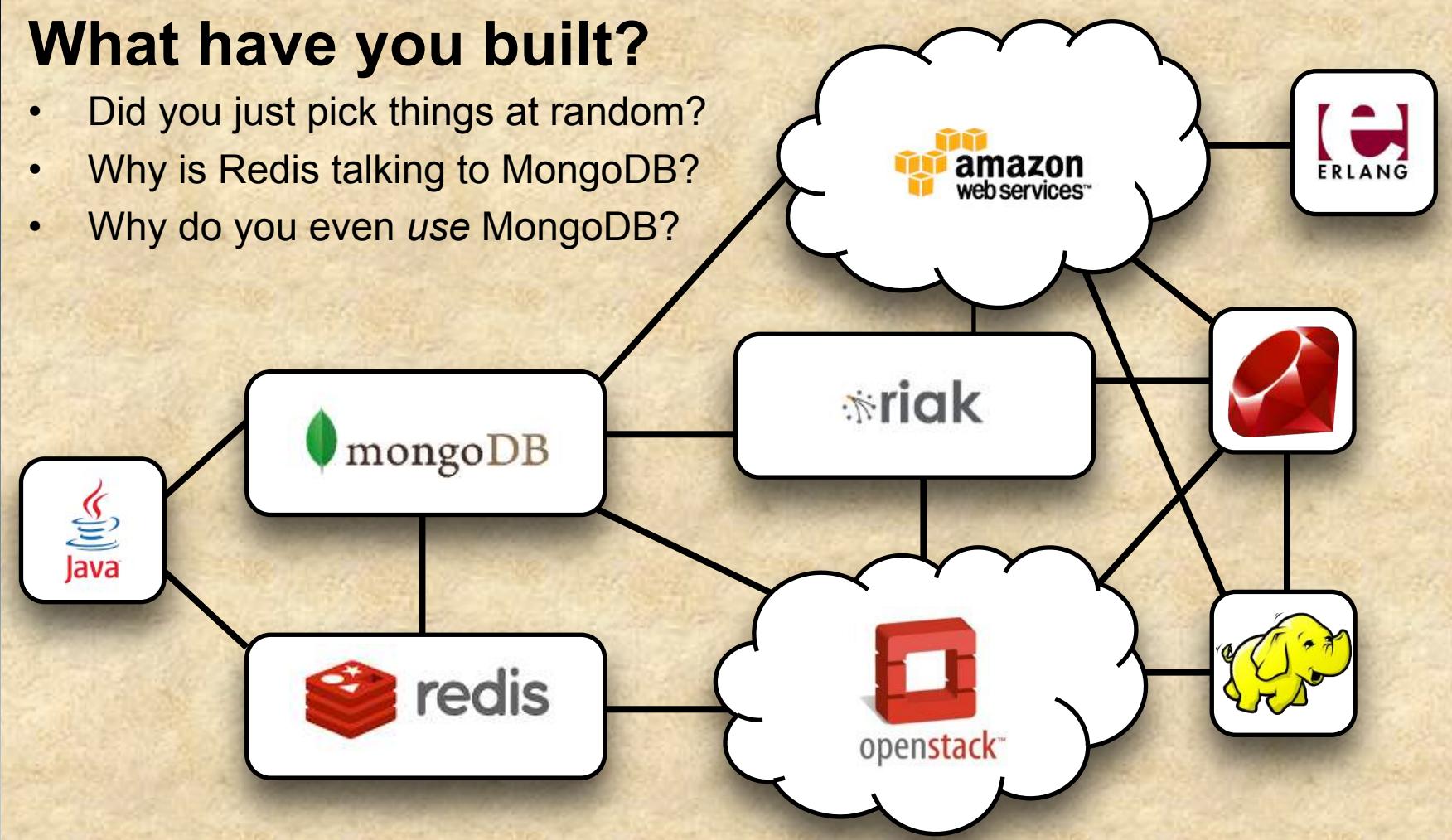
*In an often-cited post on polyglot persistence, Martin Fowler sketches a web application for a hypothetical retailer that uses each of Riak, Neo4j, MongoDB, Cassandra, and an RDBMS for distinct data sets. It's not hard to imagine his retailer's DevOps engineers quitting in droves.*

-- Stephen Pimentel

# And ...

## What have you built?

- Did you just pick things at random?
- Why is Redis talking to MongoDB?
- Why do you even *use* MongoDB?



Source: After <https://twitter.com/codinghorror/status/347070841059692545/>

# Polyglot persistence ...

- Multiple developer skills
  - The programmer must learn new languages and APIs
- Multiple DBA skills
  - The DBA must learn new backup/recovery utilities and new optimization techniques
- Multiple analyst skills
  - The analyst must study new database concepts and how to model them best

# Polyglot persistence ...



*What I've seen in the past has been is if you try to take on six of these [technologies], you need a staff of 18 people minimum just to operate the storage side - say, six storage technologies. That's not scalable and it's too expensive.*

-- Dave McCrory

# Polyglot persistence

- Different APIs
  - Develop public API for each NoSQL store (Disney)

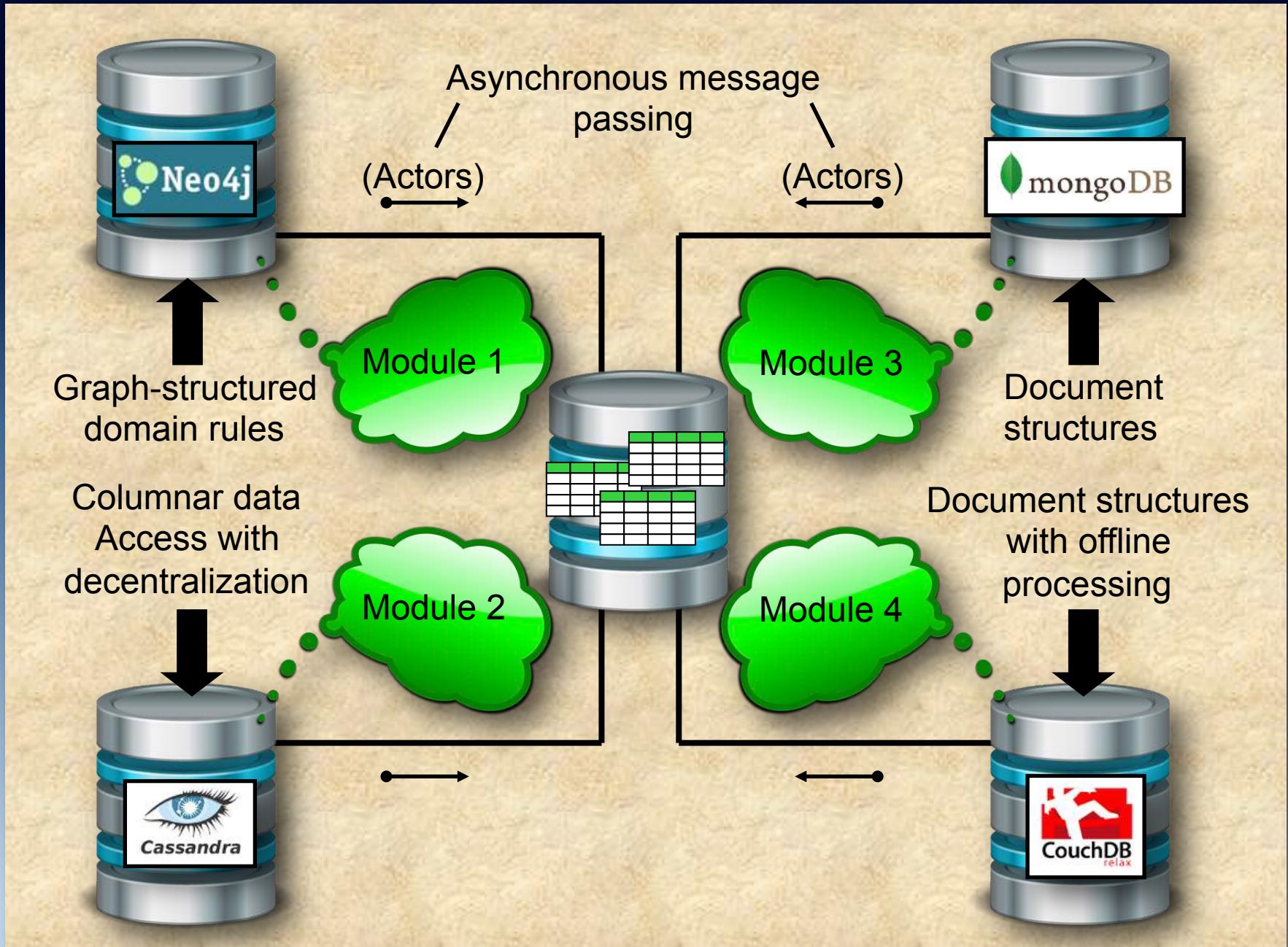
# Public API for NoSQL store



*In some cases, the team decided to hide the platform's complexity from users; not to facilitate its use, but to keep loose-cannon developers from doing something crazy that could take down the whole cluster. It could show them all the controls and knobs in a NoSQL database, but “they tend to shoot each other,” Jacob said. “First they shoot themselves, then they shoot each other.”*

# Polyglot persistence examples

- Disney
  - Cassandra, Hadoop, MongoDB
- Interactive Mediums
  - CouchDB, MySQL
- Mendeley
  - HBase, MongoDB, Solr, Voldemort
- Netflix
  - Cassandra, Hadoop/HBase, RDBMS, SimpleDB
- Twitter
  - Cassandra, FlockDB, Hadoop/HBase, MySQL



Source: Debasish Ghosh, used with permission

# Multi-paradigm example

- Application that routes picking baskets for inventory in a warehouse
- A graph with bins of inventory (nodes) along aisles (edges)
- Store graph in Neo4j for performance
- Asynchronously persist in MySQL for reporting
- Move data using asynchronous message queue
- Faster performance, easier development, simpler scaling, and reduced cost

# Polyglot persistence with EclipseLink JPA

- Java Persistence API (JPA) for access to NoSQL systems
- Annotations and XML to identify stored NoSQL entities
- An application can use multiple database systems
- Single composite Persistence Unit (PU) supports relational and non-relational data
- Support for MongoDB and Oracle NoSQL with other products planned

# Benchmarks and performance

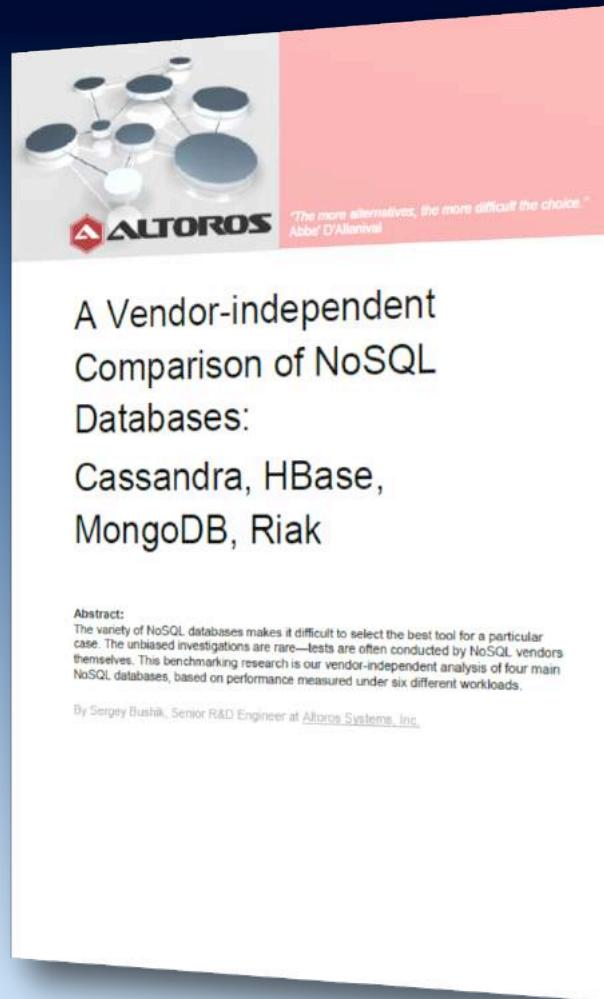


# Yahoo Cloud Serving BM ...

- Originally Tested Systems
  - Cassandra, HBase, Yahoo!'s PNUTS, sharded MySQL
- Tier 1 (performance)
  - Latency by increasing the server load
- Tier 2 (scalability)
  - Scalability by increasing the number of servers

# Yahoo Cloud Serving BM

- Yahoo Cloud Serving Benchmark (YCSB)
  - Research paper
  - Slide deck
- Various reports
  - See resources



# 2015 YCSB results ...

**AVALON**

Comparing Couchbase Server 3.0.2 with MongoDB 3.0.2  
Benchmark Results and Analysis

Composed by Avalon Consulting, LLC

**Big thinkers for Big Data**

We rule emerging technologies to give you a competitive advantage.



**Introduction**

The data needs of today's Enterprise require a special set of tools. At the core of these tools lies the NoSQL database. In recent years, NoSQL has become a growing part of the modern Enterprise infrastructure. Knowing how to implement a highly scalable NoSQL database that fits current and future use cases and scales easily and efficiently is critical in satisfying these ever-growing demands.

It's important to consider performance, scalability, consistency, and availability when selecting a NoSQL database. However, this benchmark focuses exclusively on performance. In an era where applications may have to support millions of users and where users expect faster and faster responses, performance can be the deciding factor between success and failure. A high

**AVALON**

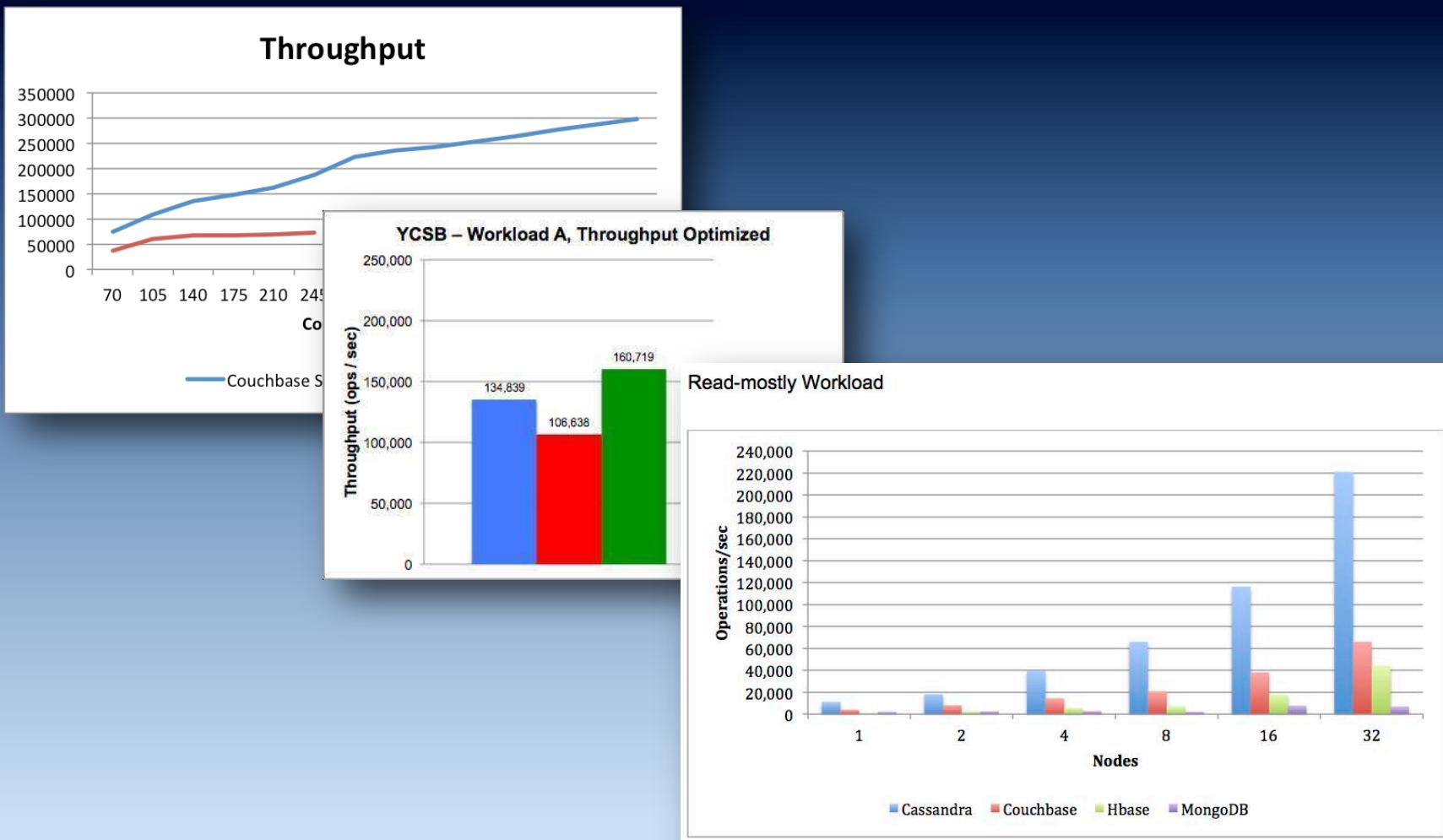
**United Software Associates**  
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## HIGH PERFORMANCE BENCHMARKING: MongoDB and NoSQL Systems

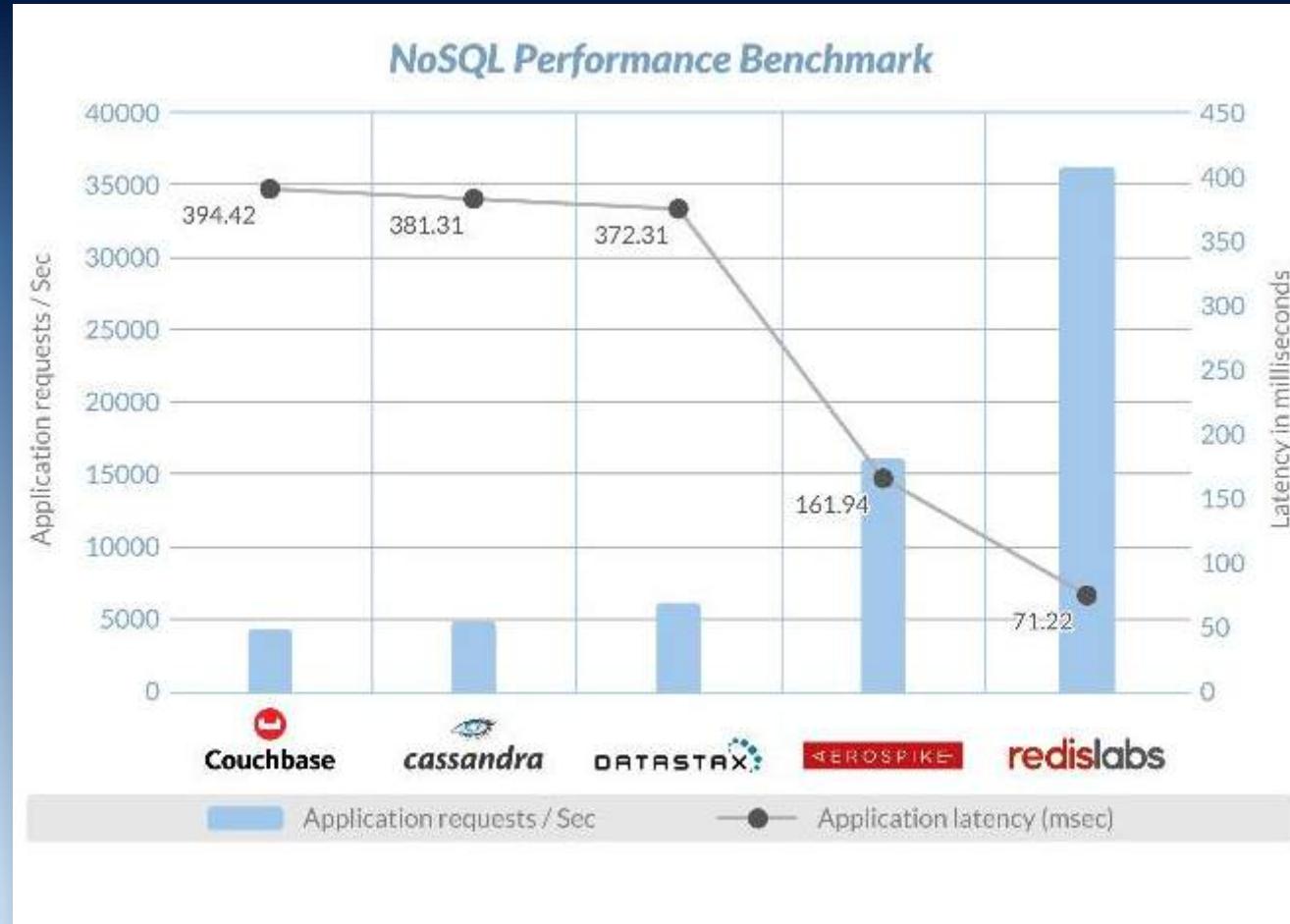


Benchmarking Top NoSQL Databases  
Apache Cassandra, Couchbase, HBase, and MongoDB  
April 13, 2015  
<http://www.endpoint.com/>

# 2015 YCSB results

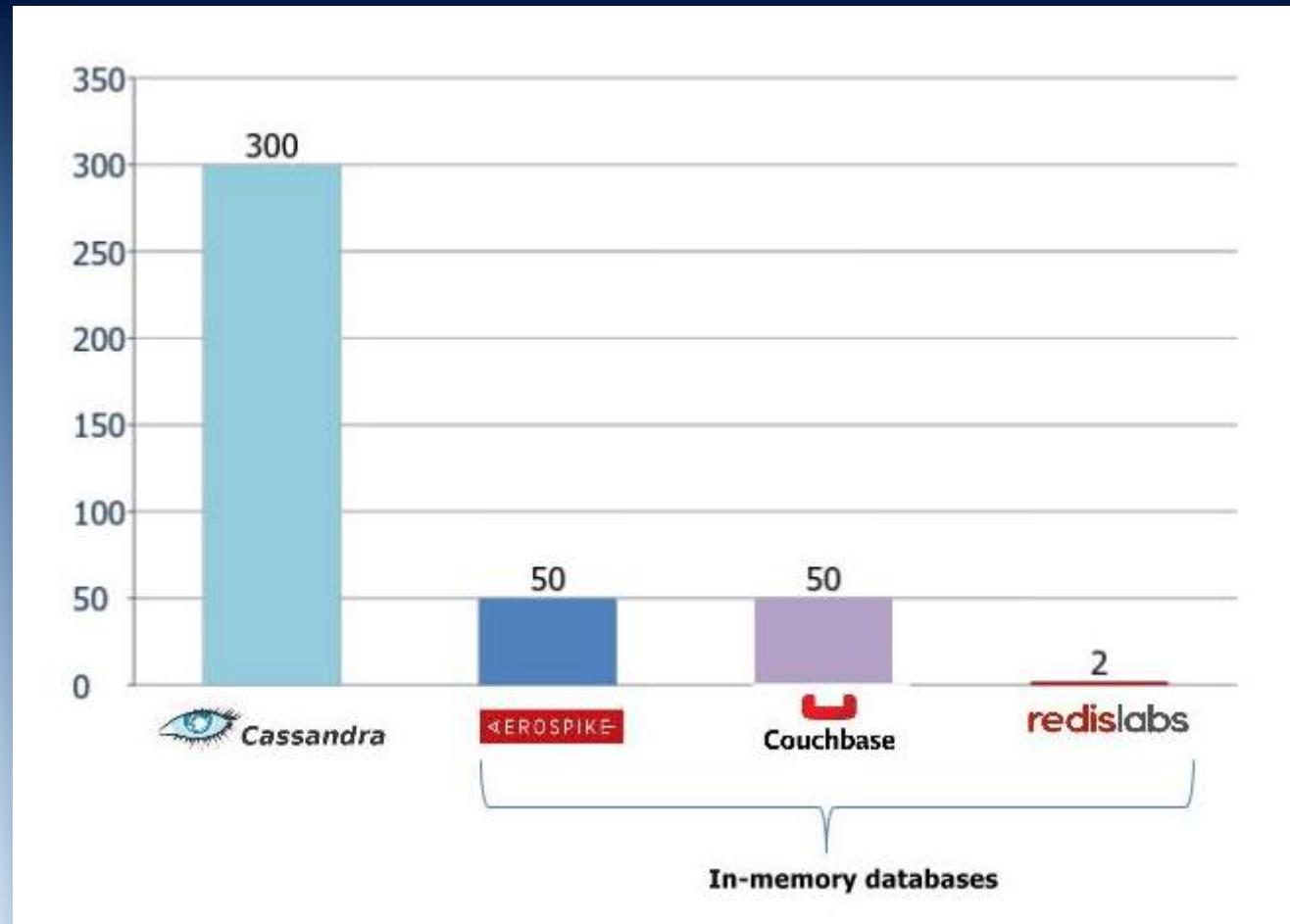


# Redis customer benchmark



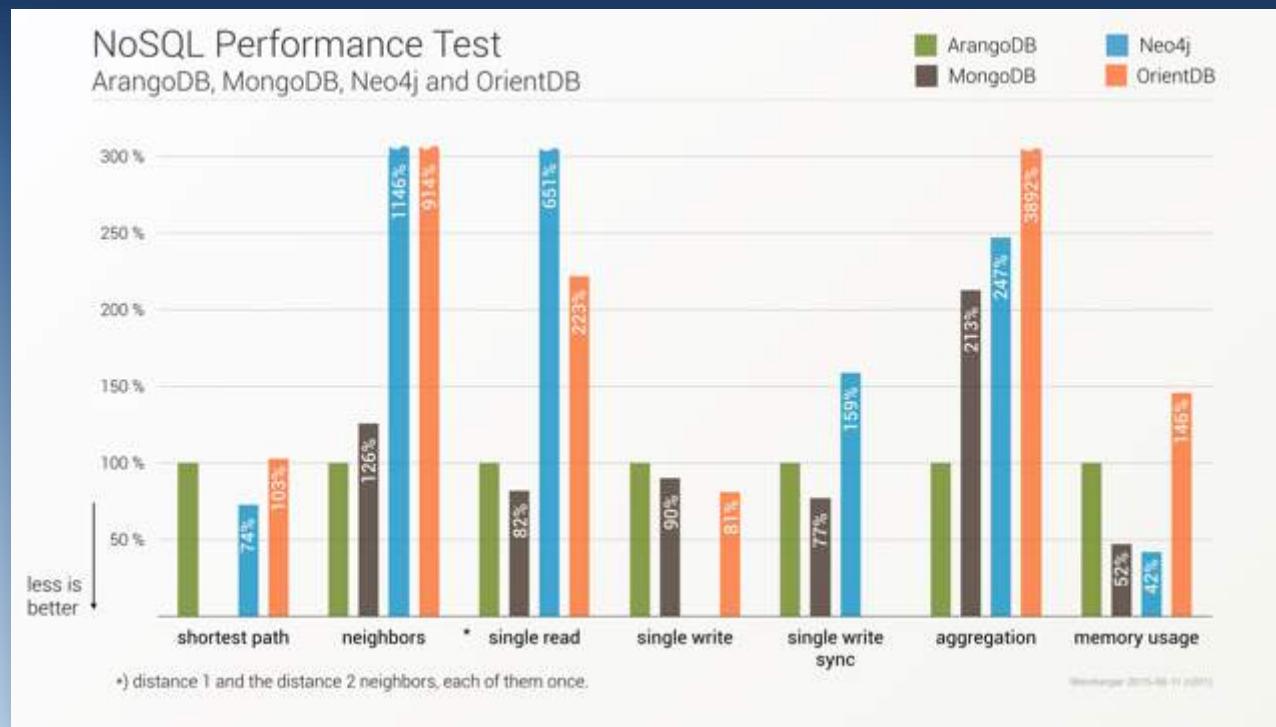
Source: "Busting 4 Myths About In-Memory Databases" Yiftach Shoolman (16 September 2015)

# How many servers to get 1 million writes/sec on GCE?



Source: "Busting 4 Myths About In-Memory Databases" Yiftach Shoolman (16 September 2015)

# Multi-model benchmark



Source: "How an open-source competitive benchmark helped to improve databases" Frank Celler (25 June 2015)

# But ...



*... any person who designs a benchmark is in a ‘no win’ situation, i.e. he can only be criticized. External observers will find fault with the benchmark as artificial or incomplete in one way or another. Vendors who do poorly on the benchmark will criticize it unmercifully.*

-- Mike Stonebraker

# “Can the Elephants Handle the NoSQL Onslaught?”

- DSS Workload (TPC-H)
  - Hive vs. Parallel Data Warehouse
- Modern OLTP Workload (YCSB)
  - MongoDB vs. SQL Server
- Conclusions
  - NoSQL systems are behind relational systems in performance

# Linked Data Benchmark Council



- EU-funded project
- Develop Graph and RDF benchmarks

# Jepsen stress testing ...

- Jepsen project
  - Rigorously test how various database systems handle partitions
  - Evaluate consistency
- Conclusions
  - Don't rely on vendor marketing, product documentation or “pull the plug” test

# Jepsen stress testing

- Postgres
- Redis
- MongoDB
- Riak
- Zookeeper
- NuoDB
- Kafka
- Cassandra
- Redis redux
- RabbitMQ
- etcd and Consul
- Elasticsearch
- MongoDB stale reads
- Elasticsearch 1.5.0
- Aerospike
- Chronos
- MariaDB Galera Cluster

# SSDs and log-structured I/O

- Database systems that use log-structured I/O have interference effects with SSDs that slow performance and increase latency
- The log-structured Flash Translation Layer (FTL) that makes flash look like a disk adversely interacts with the already log-structured I/O from the application

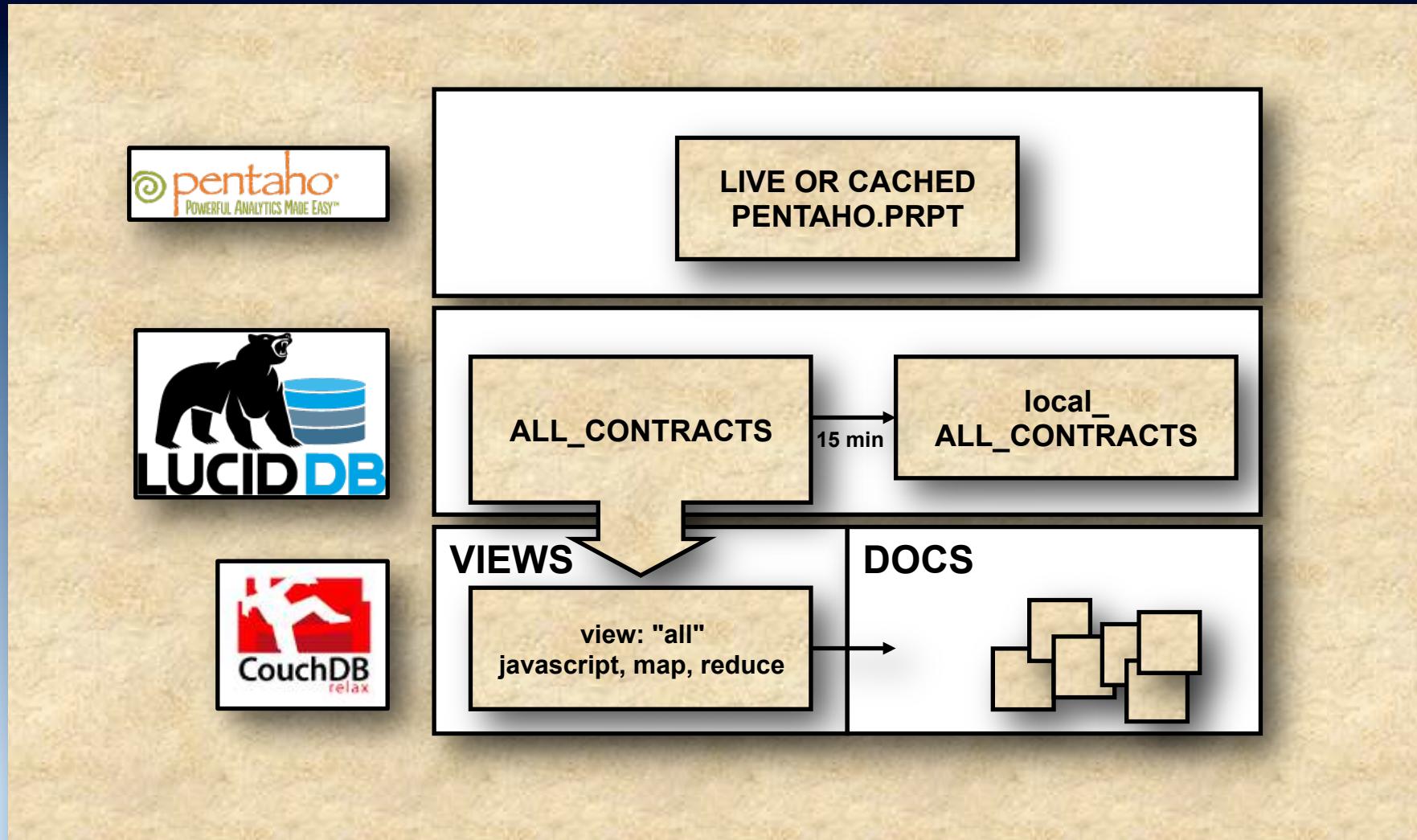
# BI/Analytics



# Architectures

- NoSQL reports
- NoSQL thru and thru
- NoSQL + MySQL
- NoSQL as ETL source
- NoSQL programs in BI tools
- NoSQL via BI database (SQL)

# NoSQL via BI database (SQL)

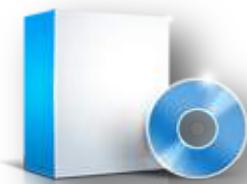


Source: “SQL access to CouchDB views : Easy Reporting” Nicholas Goodman (22 June 2011)

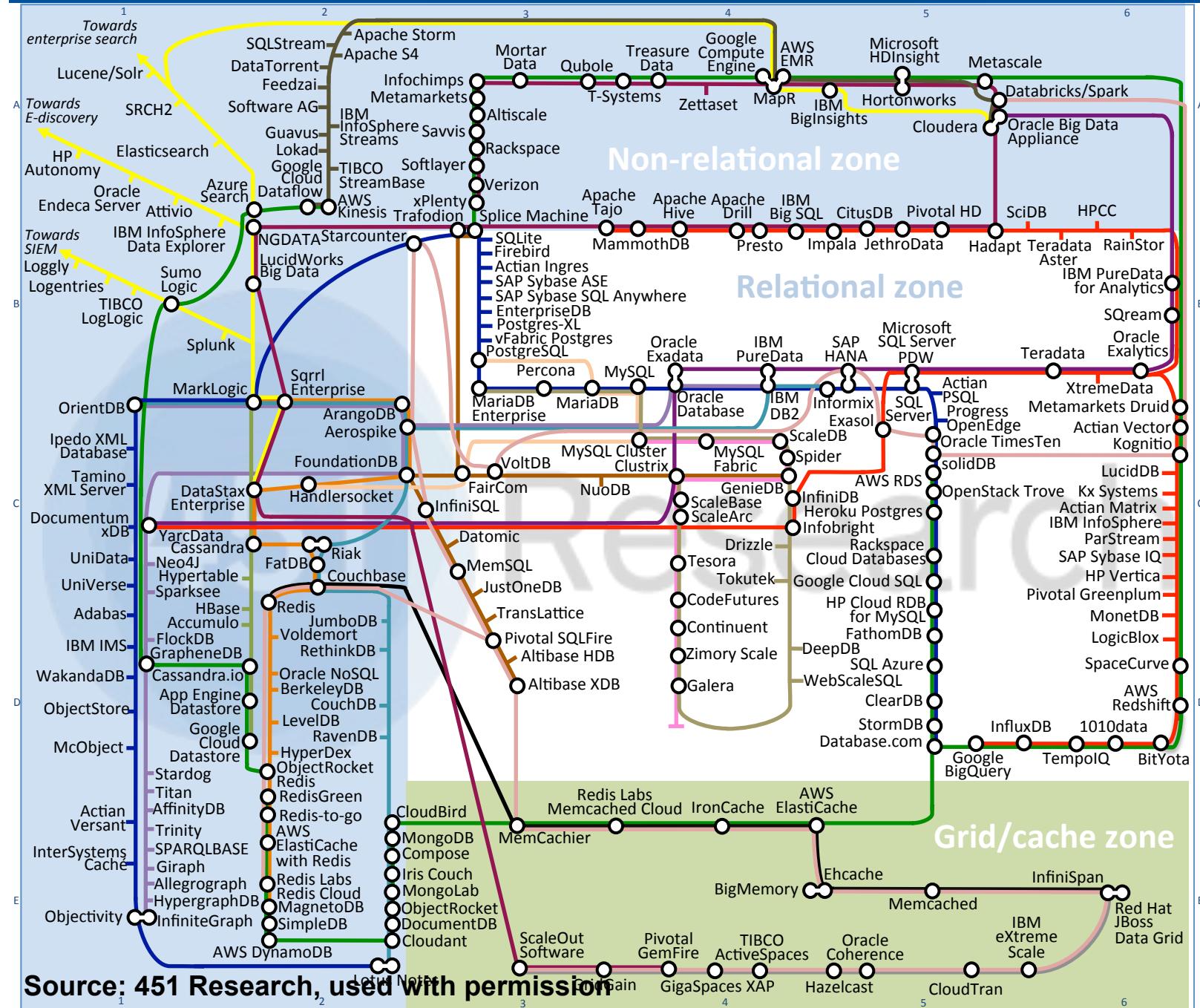
# DEMO



# NoSQL alternatives



# 451 Research: Data Platforms Landscape Map – September 2014



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# NewSQL

- Today, new challenges and requirements
  - “Web changes everything”
- Need more OLTP throughput
- Need real-time analytics
- ACID support
- Preserve SQL
  - Automatic query optimization
- Preserve investment
  - Existing skills and tools

# DEMO

# DEMO



nuoDB

# Connection

```
Class.forName("com.nuodb.jdbc.Driver");  
  
Properties properties = new Properties();  
  
properties.put("user", "dba");  
properties.put("password", "goalie");  
properties.put("schema", "test");  
  
connection = DriverManager.getConnection(  
    "jdbc:com.nuodb://localhost/test", properties);  
  
System.out.println("Connected to NuoDB");
```

# Create

```
PreparedStatement statement = connection.prepareStatement(  
    "INSERT INTO people (name, age, date, likes) VALUES (?, ?, ?, ?);  
  
statement.setString(1, "akmal");  
statement.setInt(2, 40);  
statement.setString(3, new Date().toString());  
statement.setString(4, "satay kebabs fish-n-chips");  
statement.addBatch();  
statement.executeBatch();  
connection.commit();
```

# Read

```
String query = "SELECT * FROM people;"  
  
Statement statement = connection.createStatement();  
ResultSet cursor = statement.executeQuery(query);  
  
while (cursor.next()) {  
    System.out.print(cursor.getString(1) + " ");  
    System.out.print(cursor.getInt(2) + " ");  
    System.out.print(cursor.getString(3) + " ");  
    System.out.println(cursor.getString(4));  
}  
  
cursor.close();  
statement.close();
```

# Update

```
String query =  
    "UPDATE people SET age = 29 WHERE name = 'akmal';";
```

```
Statement statement = connection.createStatement();  
statement.executeUpdate(query);  
connection.commit();  
readData(connection);
```

# Delete

```
String query = "DELETE FROM people WHERE name = 'akmal';";
```

```
Statement statement = connection.createStatement();
statement.executeUpdate(query);
connection.commit();
```

# Relational ...



*... MySQL is actually a better NoSQL than most, if it's used as a NoSQL engine ...<sup>[1]</sup>*

*... horizontally sharded MySQL data layer that allowed infinite horizontal scale.<sup>[2]</sup>*

*... we decided to build our own simple, sharded datastore on top of MySQL.<sup>[3]</sup>*

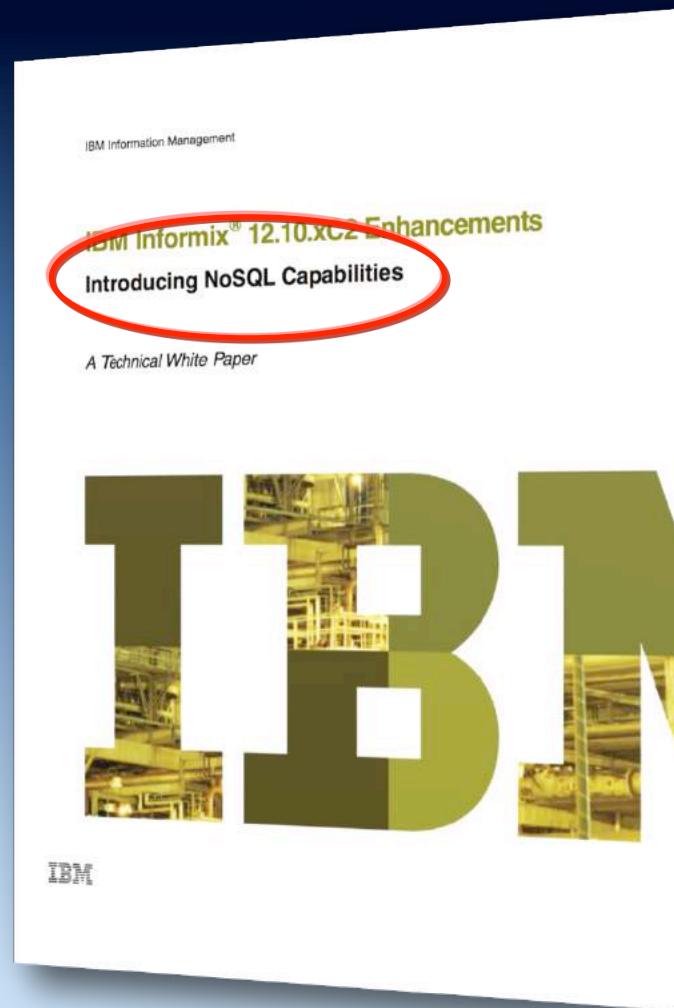
[1] <http://stackshare.io/wix/scaling-wix-to-60m-users---from-monolith-to-microservices/>

[2] <http://www.techrepublic.com/article/etsy-goes-retro-to-scale/>

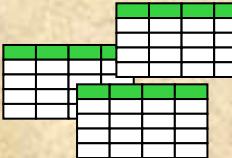
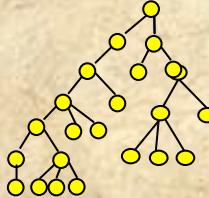
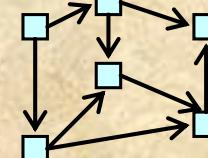
[3] <https://eng.uber.com/mezzanine-migration/>

# Relational

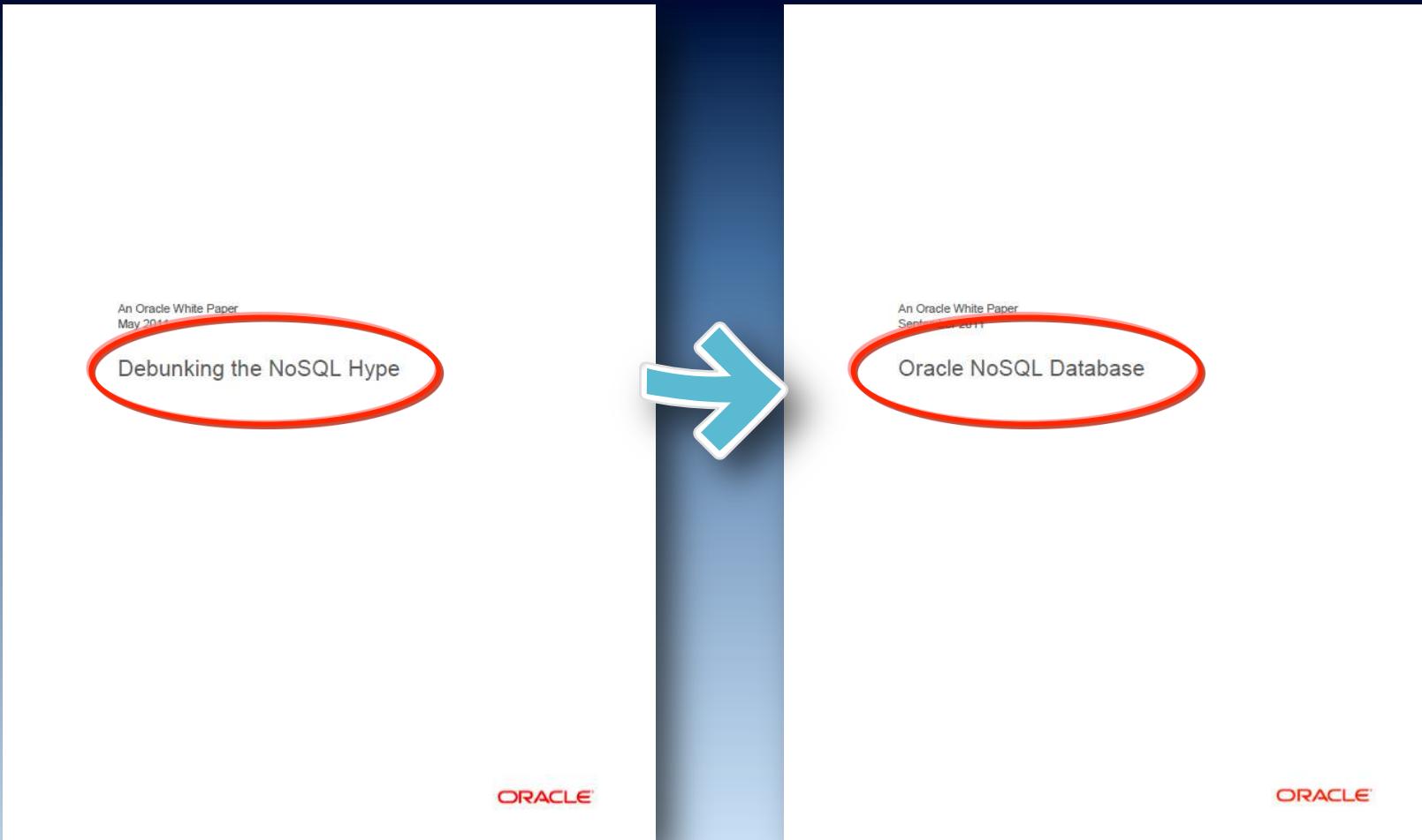
- Vendors adding NoSQL capabilities
  - Documents (JSON)
  - Linked data (RDF)



# Relational vs. XML vs. RDF

| Relational   | XML   | RDF  |
|--|---|--|
| Tables  | Trees  | Graphs  |
| Flat, highly structured  | Hierarchical data   | Linked data  |
| Rows in a table  | Nodes in a tree   | Triples describe links   |
| Fixed schema   | No or flexible schema   | Highly flexible  |
| SQL (ANSI/ISO)   | XPath/XQuery (W3C)  | SPARQL (W3C)   |

# What about Oracle?



# The meme changed (again)

**Not  
Only** SQL → No,SQL

# The rise of SQL ...



*First they ignore you, then they laugh at you, then they fight you, then you win.*

-- Mahatma Gandhi (disputed)

# The rise of SQL

| Name  | Example                                    |
|---|--|
|  ArangoDB  | AQL<br>FOR ... IN ... FILTER ... RETURN    |
|  Cassandra | CQL<br>SELECT ... FROM ... WHERE ...       |
|  Redis   | N1QL<br>SELECT ... FROM ... WHERE ...      |
|  MongoDB | <code>db.collection.find( { ... } )</code> |

# But ...



*The bottom line here is to train your developers into understanding that even if it looks like SQL and quacks like SQL, if it's on a NoSQL database then it isn't SQL.*

-- Andrew Cobley

# And ...



*... programmers have no idea what is going on behind the SQL façade, and, as a result, create programs that are wildly inefficient, far less efficient than the equivalent program in a traditional relational database.*

-- Moshe Kranc

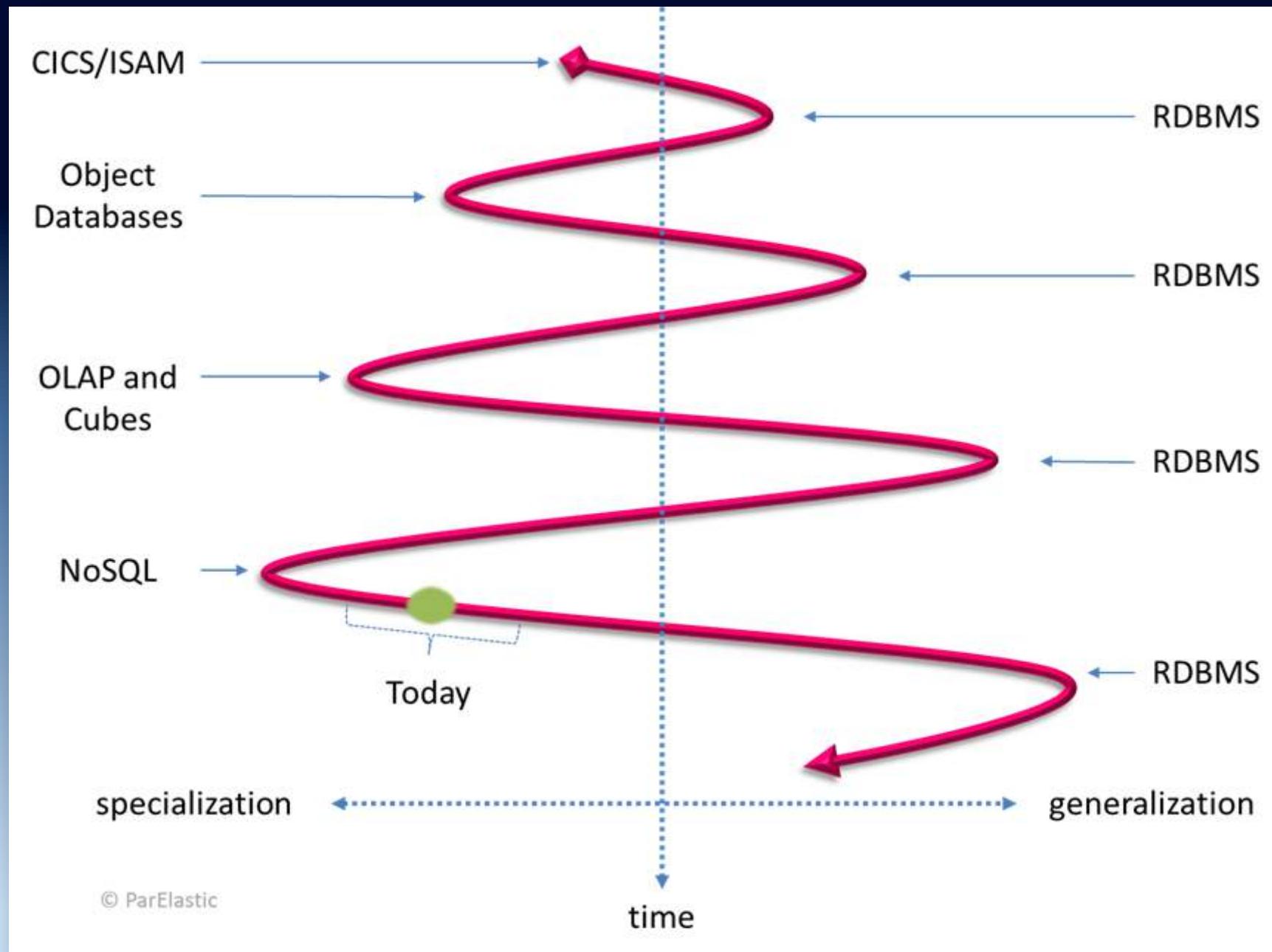
# Summary



# “The Time Tunnel”



Source: Shutterstock Image ID 135864122



Source: ParElastic, used with permission

# History repeats



*Those who cannot remember the past are condemned to repeat it.*

-- George Santayana

# Relational does NoSQL



*Often the overhead of managing data in multiple databases is more than the advantages of the other store being faster.*

*You can do “NoSQL” inside and around a hackable database like PostgreSQL, not just as a separate one.*

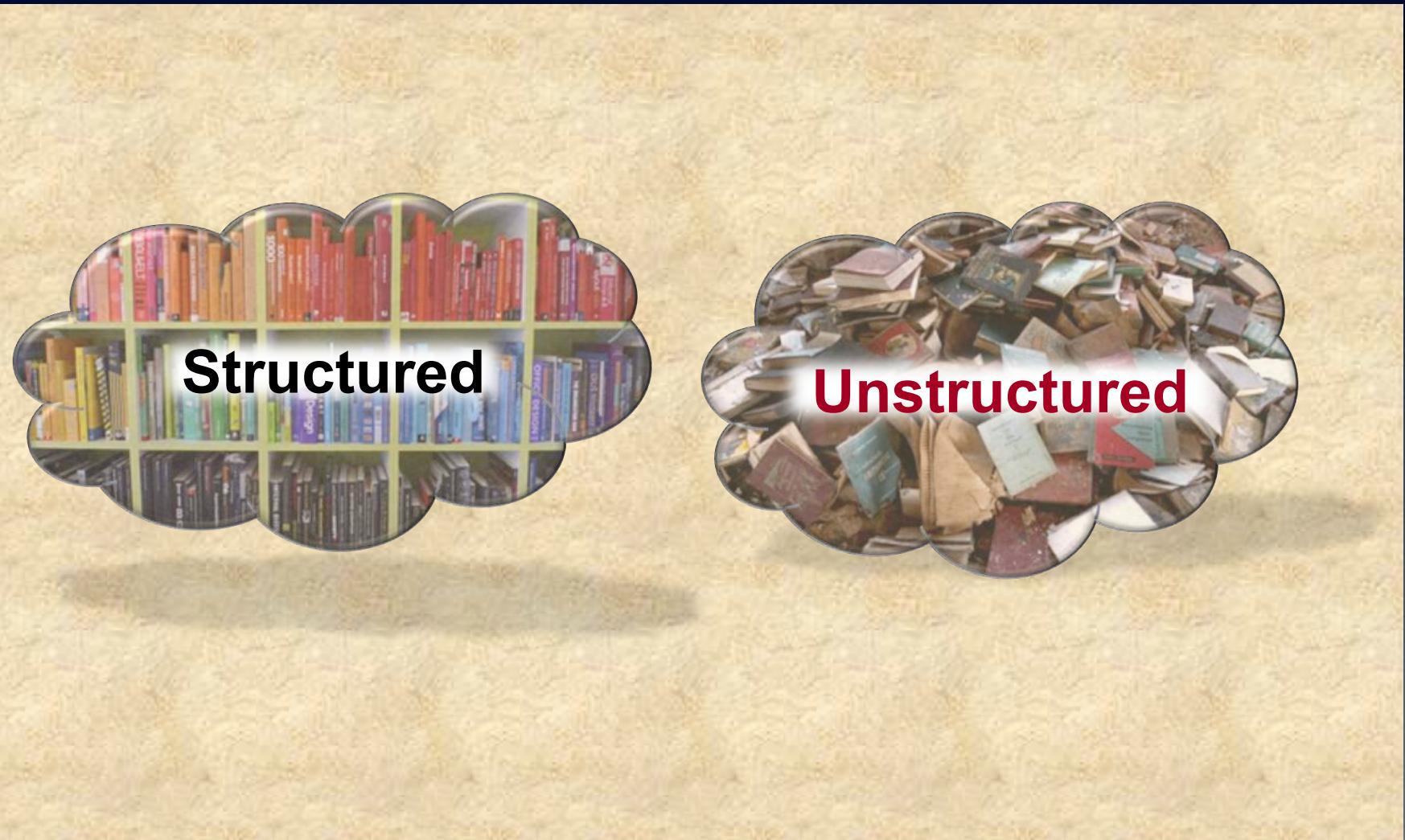
-- Hannu Krosing

# “MySQL is web scale”

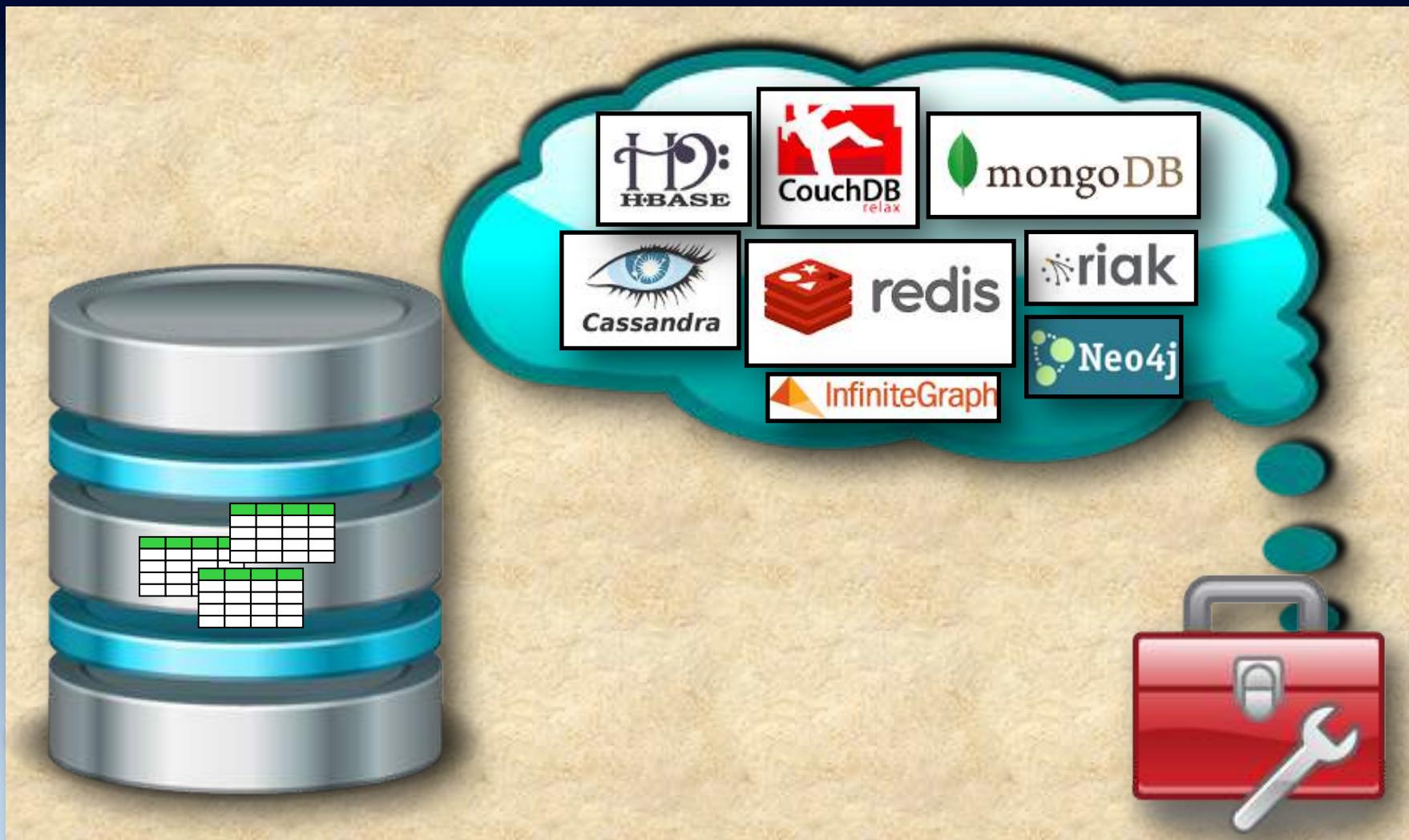


- Collaboration between Alibaba, Facebook, Google, LinkedIn and Twitter
- Adding more features to MySQL, specific to deployments in large-scale environments

# Structured vs. unstructured



# Relational vs. NoSQL toolbox



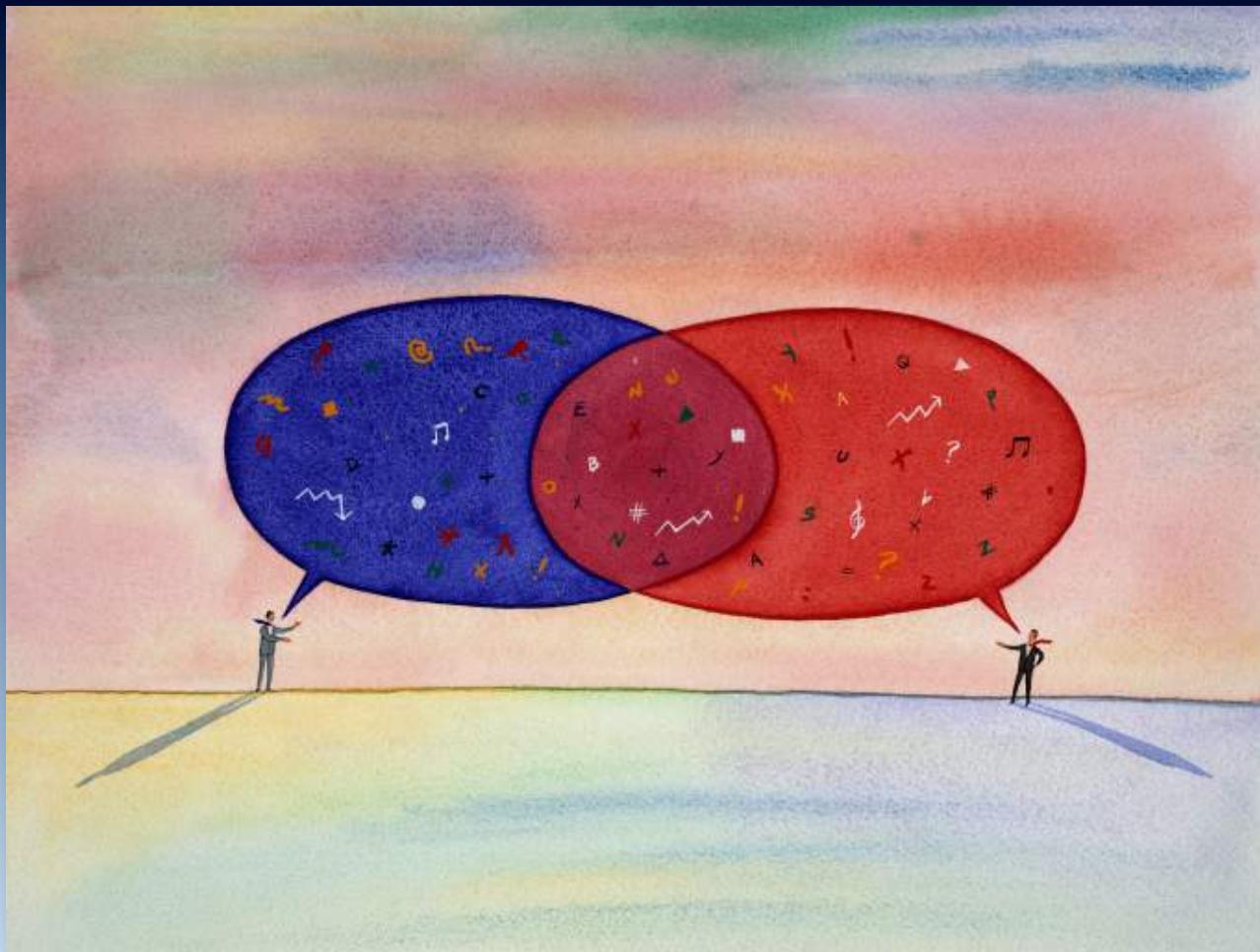
# Relational vs. NoSQL ...



*It is specious to compare NoSQL databases to relational databases; as you'll see, none of the so-called “NoSQL” databases have the same implementation, goals, features, advantages, and disadvantages. So comparing “NoSQL” to “relational” is really a shell game.*

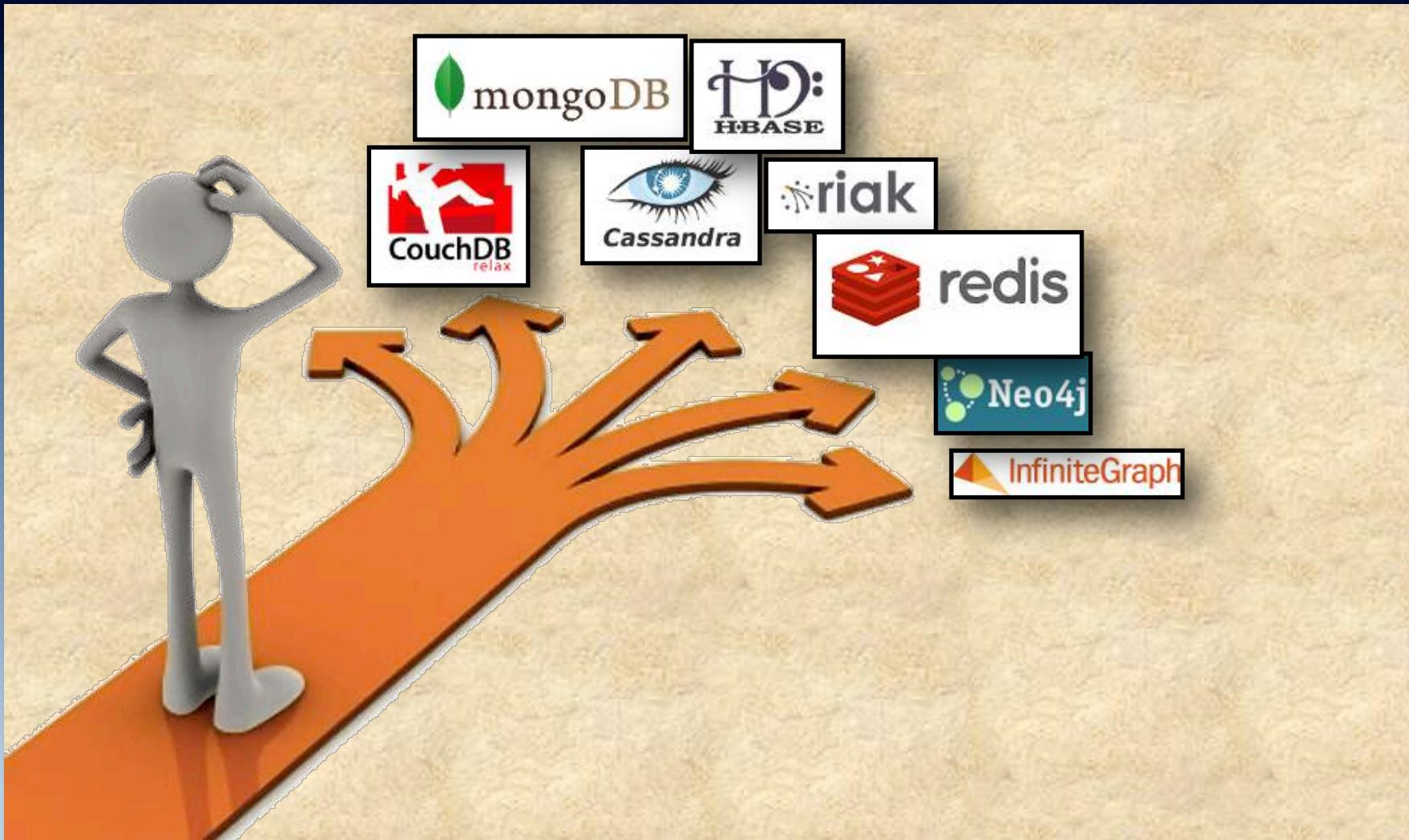
-- Eben Hewitt

# Relational vs. NoSQL

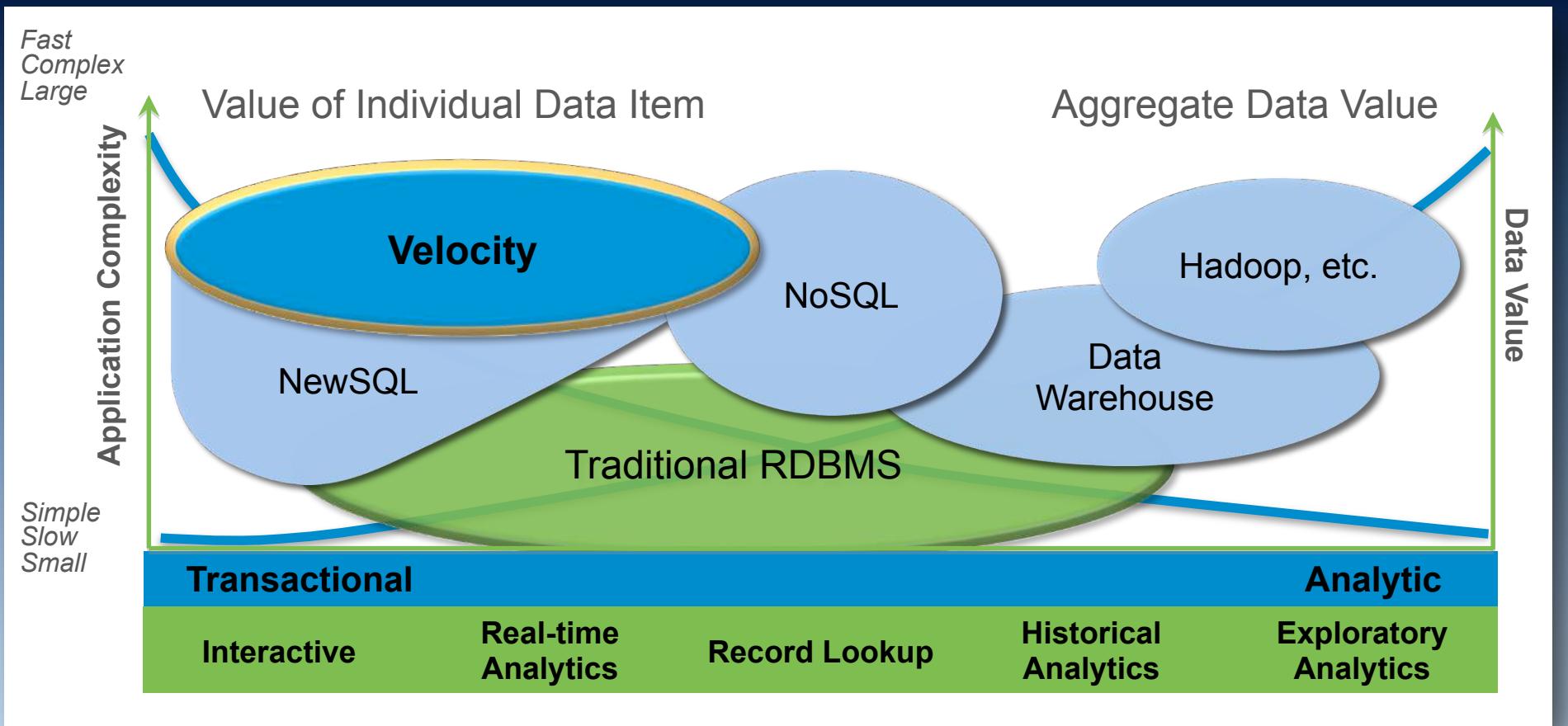


Source: Getty Image ID WCO\_016

# Choices, choices

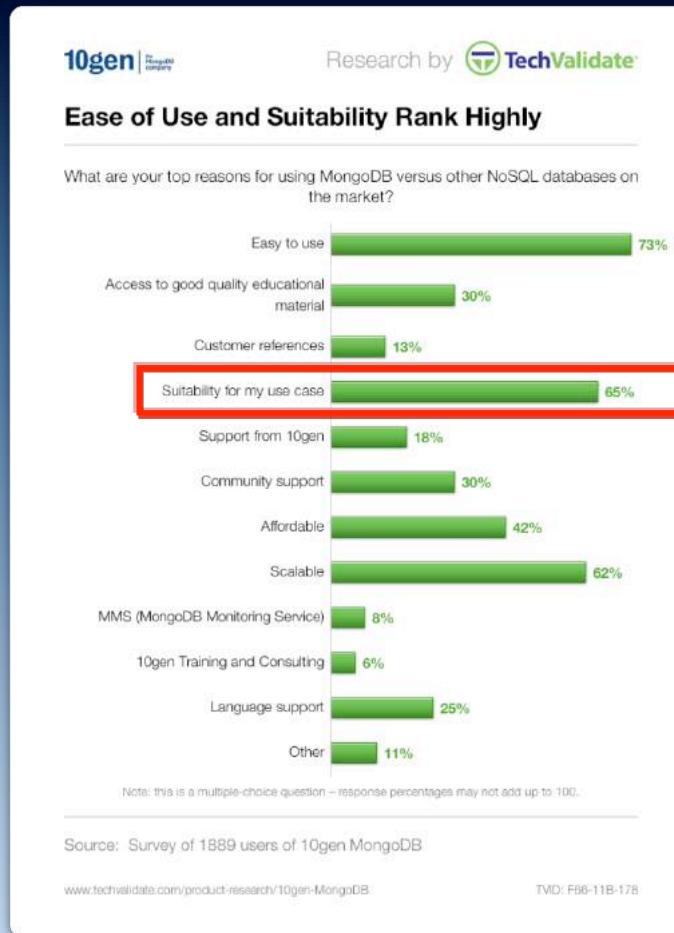


# Navigating the DB universe



Source: VoltDB, used with permission

# Understand your use case



Source: <http://www.techvalidate.com/tvid/F66-11B-178/>

# Understand vendor-speak

| What vendor says            | What vendor means  |
|-----------------------------|--|
| The biggest in the world    | The biggest one we've got  |
| The biggest in the universe | The biggest one we've got  |
| There is no limit to ...    | It's untested, but we don't mind if you try it                                     |
| A new and unique feature    | Something the competition has had for ages   |
| Currently available feature | We are about to start Beta testing   |
| Planned feature             | Something the competition has, that we wish we had too, that we might have one day |
| Highly distributed          | International offices  |
| Engineered for robustness   | Comes in a tough box   |

Source: "Object Databases: An Evaluation and Comparison" Bloor Research (1994)

# Vendor marketing example



*Really, really effective marketing masks  
MongoDB's shortcomings...*

-- Robert Roland

# Really effective marketing not unique to NoSQL



*I would have made Oracle do serious quality control and not confuse future tense and present tense with regard to product features.*

-- Mike Stonebraker

# “Foundation”



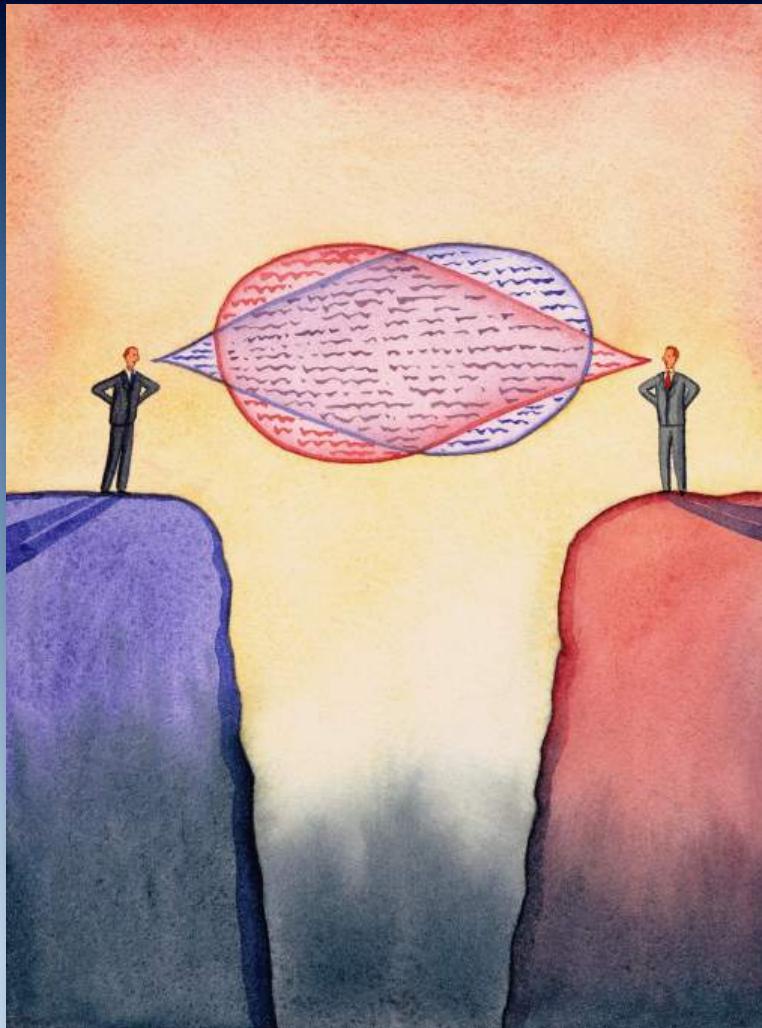
*... there is a branch of human knowledge known as symbolic logic ... When Holk, after two days of steady work, succeeded in eliminating meaningless statements, vague gibberish, useless qualifications - in short, all the goo and dribble - he found he had nothing left. Everything canceled out.*

-- Isaac Asimov

# Understand the risks



# The great debate ...



Source: Getty Image ID WCO\_011

# The great debate ...



*About every ten years or so, there is a “great debate” between, on the one hand, those who see the problem of data modelling through a more or less relational lens, and on the other, a noisier set of “refuseniks” who have a hot new thing to promote. The debate usually goes like this:*

# The great debate ...



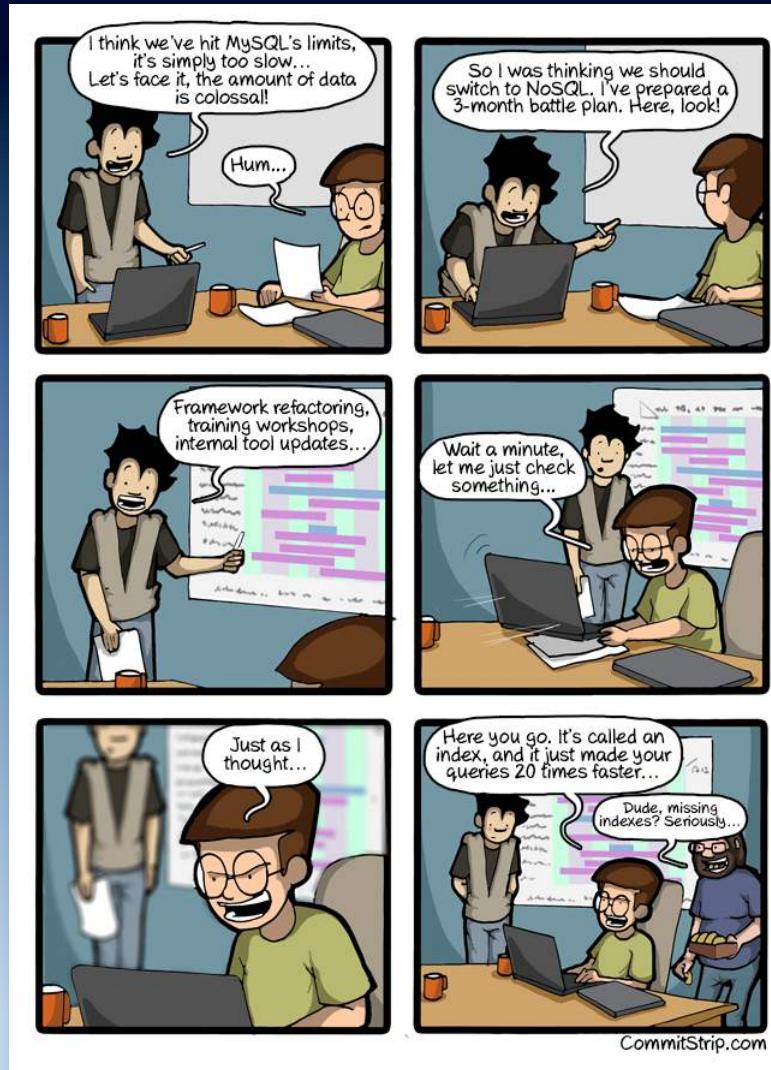
**Refuseniks:** Hah! You relational people with your flat tables and silly query languages! You are so unhip! You simply cannot deal with the problem of [INSERT NEW THING HERE]. With an [INSERT NEW THING HERE]-DBMS we will finish you, and grind your bones into dust!

# The great debate



**R-people:** You make some good points. But unfortunately a) there is an enormous amount of money invested in building scalable, efficient and reliable database management products and no one is going to drop all of that on the floor and b) you are confusing DBMS engineering decisions with theoretical questions. We plan to incorporate the best of these ideas into our products.

# The problem is not the tool itself



Source: CommitStrip, used with permission

# It's the people ...



*... MongoDB Day London ... the problem is the people! They all talk like this:*

1. *Some problem that just doesn't really exist (or hasn't existed for a very long time) with relational databases*
  2. *MongoDB*
  3. *Profit!*
- Gaius Hammond

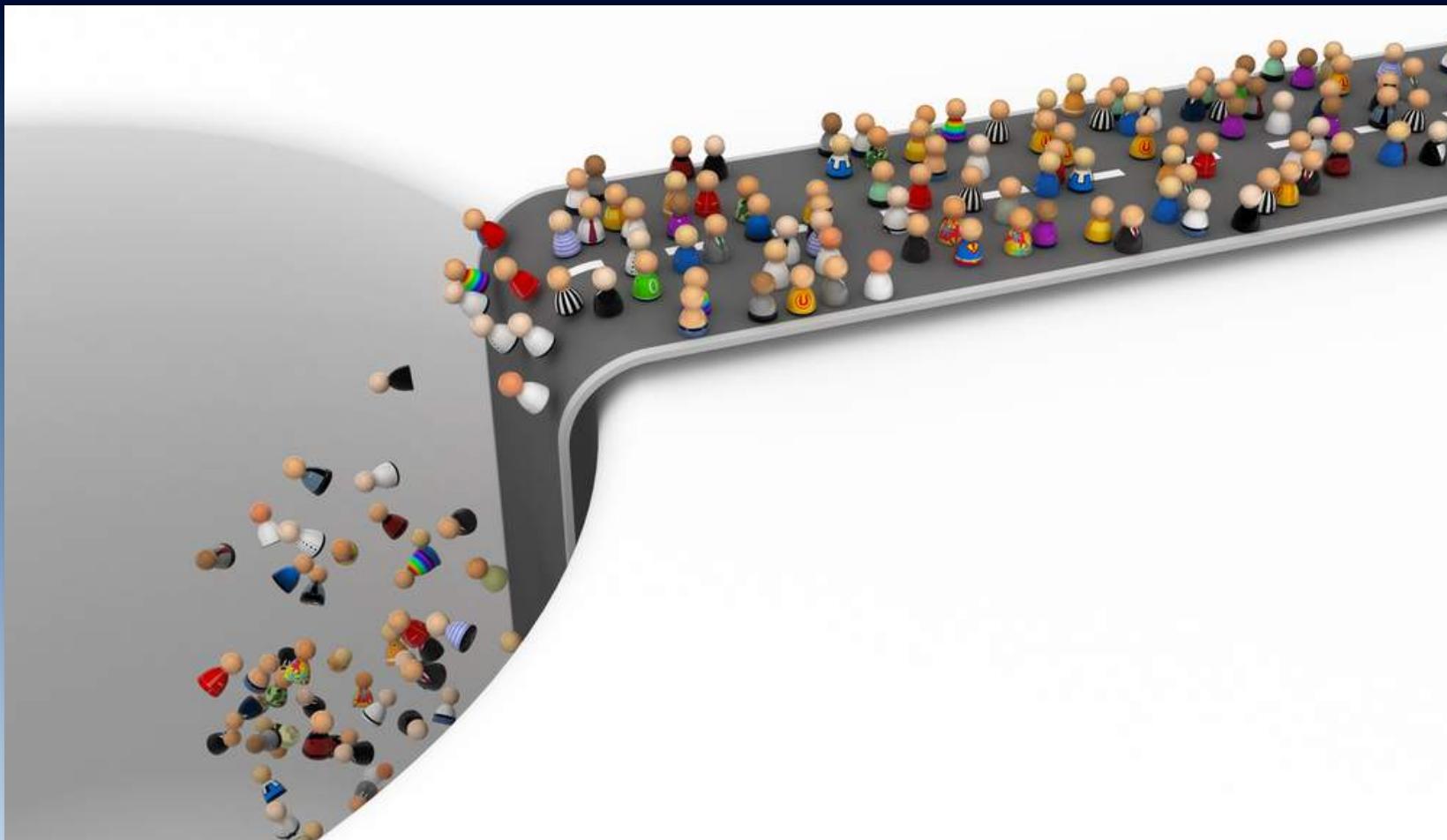
# It's the people



*... most of the business people driving the Big Data NoSQL databases are data management illiterate; don't recognize the lack of NoSQL data management facilities ... and don't know anything about availability, referential integrity and normalized data designs.*

-- Dave Beulke

# Don't be a Lemming



Source: Shutterstock Image ID 34566709

# Limitations of NoSQL

- Lack of standardized or well-defined semantics
  - Transactions? Isolation levels?
- Reduced consistency for performance and scalability
  - “Eventual consistency”
  - “Soft commit”
- Limited forms of access, e.g. often no joins, etc.
- Proprietary interfaces
- Large clusters, failover, etc.?
- Security?

# Hurdles to NoSQL adoption

- Immaturity of existing systems
- Lack of training and knowledge
- Too many choices
- Lack of mature tools
- The need for more use cases

# Future directions

- Internal polyglot support (polymorphic?)
- Multi-model systems
- Google F1-inspired systems
  - “Can you have a scalable database without going NoSQL? Yes.”
- Further support for NoSQL in Relational
- DBaaS



# Final thoughts



*We are clearly in the phase of a new technology adoption in which the category is hyped, its benefits over-promised, its limitations poorly understood, and its value oversold.*

-- Tim Berglund

# There will be harmony



Source: Shutterstock Image ID 73418620



# Contact details



# Find me on



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<http://plus.google.com/+AkmalChaudhri/>



<http://www.slideshare.net/VeryFatBoy/>



<http://www.youtube.com/VeryFatBoyVideos/>



Akmal B. Chaudhri  
*firstname.lastname@live.com*

# Questions?



**Source: Shutterstock Image ID 194875901**

{"thank":"You"}

# Resources



# Recommended reading ...

- Choosing the right NoSQL database for the job:  
a quality attribute evaluation
  - <http://www.journalofbigdata.com/content/2/1/18/>
- Gartner Magic Quadrant for Operational  
Database Management Systems (2015)
  - <https://info.microsoft.com/CO-SQL-CNTNT-FY16-09Sep-14-MQOperational-Register.html>

# Recommended reading

- Learn to stop using shiny new things and love MySQL
  - <https://engineering.pinterest.com/blog/learn-stop-using-shiny-new-things-and-love-mysql/>
- MongoDB Days
  - <https://gaiustech.wordpress.com/2013/04/13/mongodb-days/>

# History ...

- First NoSQL meetup
  - <http://nosql.eventbrite.com/>
  - <http://blog.oskarsson.nu/post/22996139456/nosql-meetup>
- First NoSQL meetup debrief
  - <http://blog.oskarsson.nu/post/22996140866/nosql-debrief>
- First NoSQL meetup photographs
  - <http://www.flickr.com/photos/russss/sets/72157619711038897/>

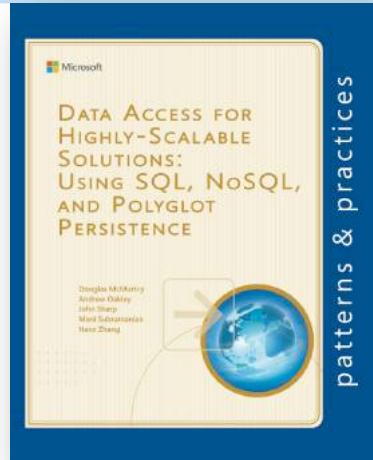
# History

- Codd's Relational Vision - Has NoSQL Come Full Circle?
  - <http://www.opensourceconnections.com/2013/12/11/codds-relational-vision-has-nosql-come-full-circle/>

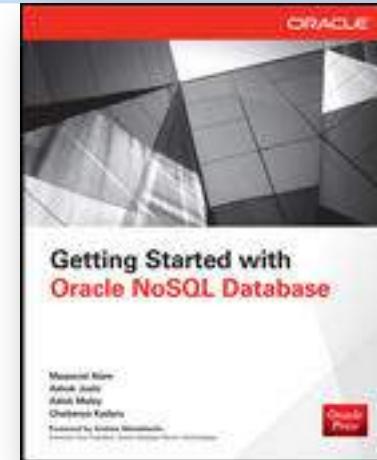
# Web sites

- NoSQL Databases and Polyglot Persistence: A Curated Guide
  - <http://nosql.mypopescu.com/>
- NoSQL: Your Ultimate Guide to the Non-Relational Universe!
  - <http://nosql-database.org/>

# Free books ...

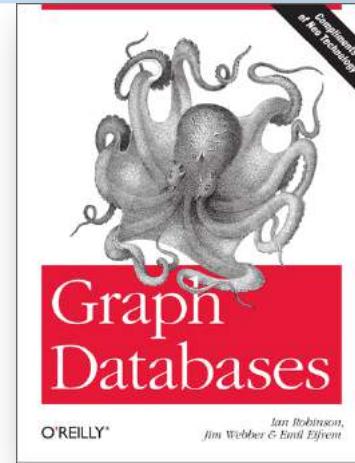
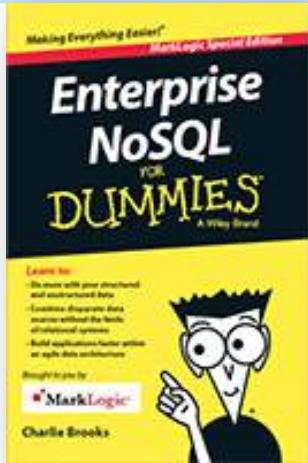


patterns & practices



- Data Access for Highly-Scalable Solutions: Using SQL, NoSQL, and Polyglot Persistence
  - <http://www.microsoft.com/en-us/download/details.aspx?id=40327>
- Getting Started with Oracle NoSQL Database
  - <http://books.mcgraw-hill.com/ebookdownloads/NoSQL/>

# Free books ...



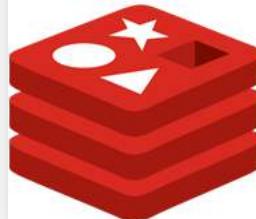
- Enterprise NoSQL for Dummies
  - <http://www.nosqlfordummies.com/>
- Graph Databases
  - <http://www.graphdatabases.com/>

# Free books ...

The Little MongoDB Book  
by Karl Seguin

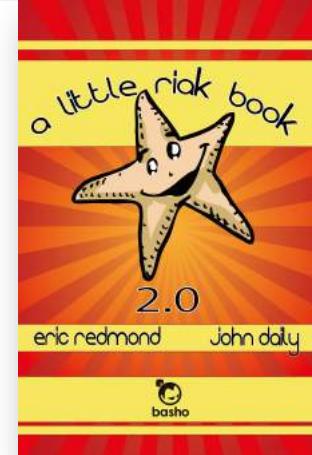
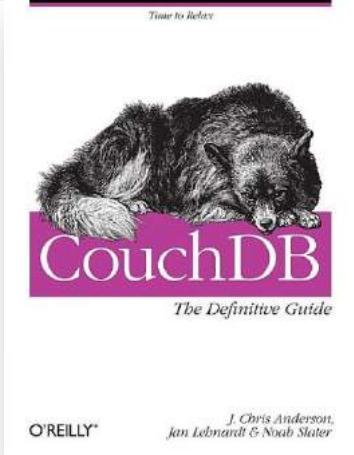


The Little Redis Book  
by Karl Seguin



- The Little MongoDB Book
  - <http://openmymind.net/mongodb.pdf>
- The Little Redis Book
  - <http://openmymind.net/redis.pdf>

# Free books ...



- CouchDB: The Definitive Guide
  - <http://guide.couchdb.org/>
- A Little Riak Book
  - [https://github.com/coderoshi/little\\_riak\\_book/](https://github.com/coderoshi/little_riak_book/)

# Free books ...

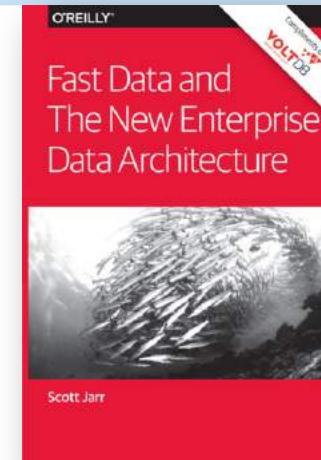


**DATADOG**



- Understanding The Top 5 Redis Performance Metrics
  - <https://www.datadoghq.com/wp-content/uploads/2013/09/Understanding-the-Top-5-Redis-Performance-Metrics.pdf>
- DBA's Guide to NoSQL
  - <https://www.smashwords.com/books/view/479798/>

# Free books



- **Mastering Hazelcast**
  - <http://hazelcast.com/resources/mastering-hazelcast/>
- **Fast Data and the New Enterprise Data Architecture**
  - <http://voltdb.com/fast-data-and-new-enterprise-data-architecture/>

# Free training ...



- MongoDB
  - <https://university.mongodb.com/>

# Free training ...

- Aerospike
  - <http://www.aerospike.com/training/<administration | development>/online/>
- Cassandra
  - <https://academy.datastax.com/>
- Couchbase
  - <https://training.couchbase.com/online>

# Free training

- Neo4j
  - [http://www.neo4j.org/learn/online\\_course/](http://www.neo4j.org/learn/online_course/)
- OrientDB
  - <http://www.orientechnologies.com/getting-started/>

# Articles ...

- The State of NoSQL
  - <http://www.infoq.com/articles/State-of-NoSQL/>
- An Introduction to NoSQL Patterns
  - <http://architects.dzone.com/articles/introduction-nosql-patterns>
- The NoSQL Advice I Wish Someone Had Given Me
  - <http://sql.dzone.com/articles/nosql-advice-i-wish-someone>

# Articles ...

- Why is the NoSQL choice so difficult?
  - <http://www.itworld.com/article/2696615/big-data/why-is-the-nosql-choice-so-difficult-.html>
- NoSQL is a no go once again
  - <http://www.itworld.com/article/2696893/big-data/nosql-is-a-no-go-once-again.html>

# Articles

- Why horizontal scalability shouldn't be a focus for software startups
  - <http://www.itworld.com/article/2984271/development/why-horizontal-scalability-shouldnt-be-a-focus-for-software-startups.html>

# Free reports ...

- A deep dive into NoSQL: A complete list of NoSQL databases
  - <http://www.bigdata-madesimple.com/a-deep-dive-into-nosql-a-complete-list-of-nosql-databases/>
- Deconstructing NoSQL
  - <http://whitepapers.dataversity.net/content37165/>
- Dzone's Guide to Database & Persistence Management
  - <https://dzone.com/guides/database-persistence-management>

# Free reports ...

- Gartner Magic Quadrant for Operational Database Management Systems (2013)
  - <http://oracledbacr.blogspot.co.uk/2014/01/magic-quadrant-for-operational-database.html>
- Gartner Magic Quadrant for Operational Database Management Systems (2015)
  - <https://info.microsoft.com/CO-SQL-CNTNT-FY16-09Sep-14-MQOperational-Register.html>

# Free reports ...

- Five Data Persistence Dilemmas That Will Keep CIOs Up at Night
  - <http://www1.memsql.com/gartner-cio-report/>
- Critical Capabilities for Operational Database Management Systems
  - <http://go.nuodb.com/gartner-critical-capabilities.html>
- When to Use New RDBMS Offerings in a Dynamic Data Environment
  - <http://go.nuodb.com/avant-garde-databases.html>

# Free reports ...

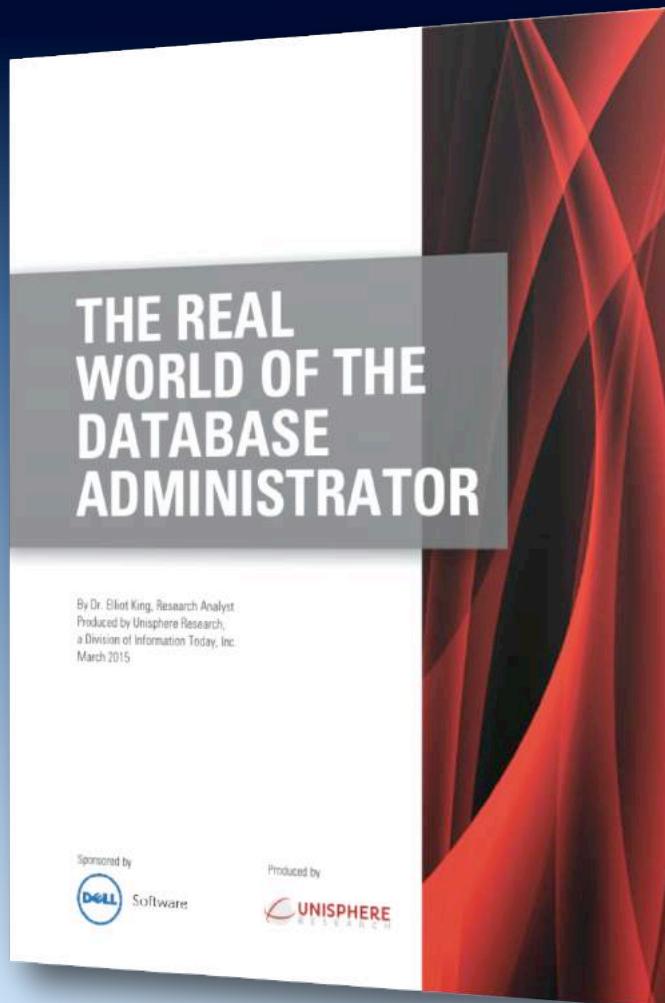
- The Forrester Wave™: NoSQL Key-Value Databases, Q3 2014
  - <https://www.mapr.com/forrester-wave-hadoop-nosql-key-value-databases>
- The Forrester Wave™: NoSQL Document Databases, Q3 2014
  - <http://info.marklogic.com/forrester-wave.html>
- Forrester Ranks the NoSQL Database Vendors
  - <http://www.datanami.com/2014/10/03/forrester-ranks-nosql-database-vendors/>

# Free reports ...

- The Forrester Wave™: In-Memory Database Platforms, Q3 2015
  - <http://www1.memsql.com/forrester/>

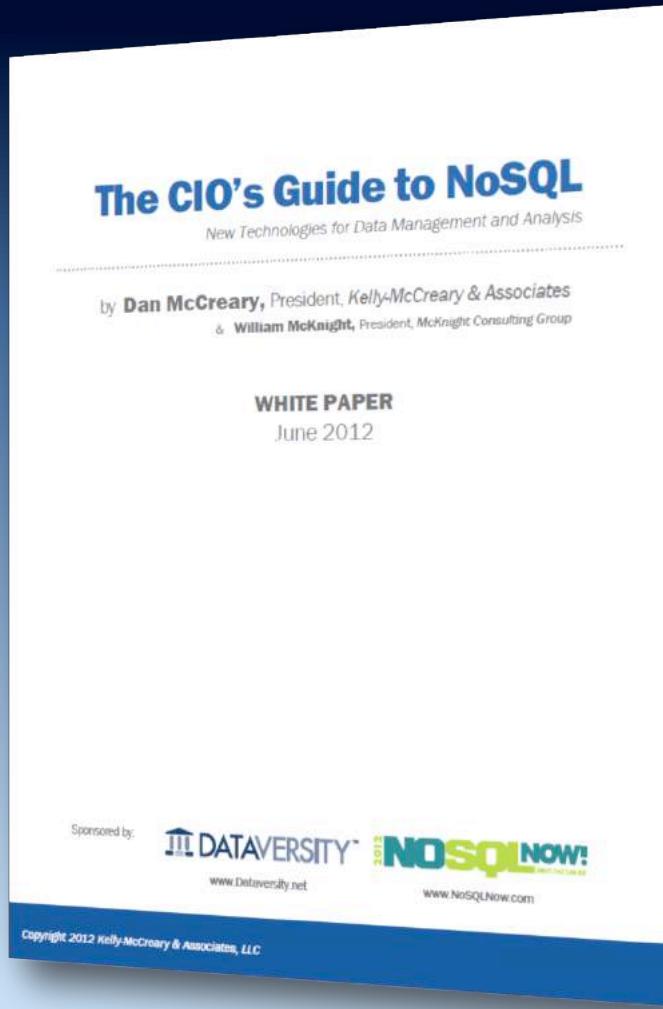
# Free reports

- The Real World of The Database Administrator
  - <https://software.dell.com/whitepaper/the-real-world-of-the-database-administrator-875469/>



# White papers

- The CIO's Guide to NoSQL
  - [http://  
documents.dataversity  
.net/whitepapers/the-  
cios-guide-to-  
nosql.html](http://documents.dataversity.net/whitepapers/the-cios-guide-to-nosql.html)



# Vendor funding ...

- Visualizing the \$1bn+ VC investment in Hadoop and NoSQL
  - [http://blogs.the451group.com/information\\_management/2013/12/17/visualizing-the-1bn-vc-investment-in-hadoop-and-nosql/](http://blogs.the451group.com/information_management/2013/12/17/visualizing-the-1bn-vc-investment-in-hadoop-and-nosql/)
- Hadoop vs. NoSQL - Which Big Data Technology Has Raised More Funding?
  - <http://www.cbinsights.com/blog/hadoop-nosql-venture-capital-funding/>

# Vendor funding

- The NoSQLNow conference in San Jose this week
  - <http://swtrends.wordpress.com/2014/08/22/the-nosqlnow-conference-in-san-jose-this-week/>
- NoSQL market frames larger debate: Can open source be profitable?
  - <http://siliconangle.com/blog/2015/03/19/nosql-market-frames-larger-debate-can-open-source-be-profitable/>

# Brewer's CAP “Theorem” ...

- Towards Robust Distributed Systems
  - <http://www.cs.berkeley.edu/~brewer/cs262b-2004/PODC-keynote.pdf>
- Deconstructing the ‘CAP theorem’ for CM and DevOps
  - [http://markburgess.org/blog\\_cap.html](http://markburgess.org/blog_cap.html)
- NoCAP Or, Achieving Scalability Without Compromising on Consistency
  - <http://www.gigaspaces.com/system/files/private/resource/NoCAPfinal0711.pdf>

# Brewer's CAP “Theorem” ...

- Brewer's CAP Theorem
  - <http://www.julianbrowne.com/article/viewer/brewers-cap-theorem>
- Confused CAP Arguments
  - <http://www.stucharltion.com/blog/archives/2010/10/confused-cap-arguments.html>
- Please stop calling databases CP or AP
  - <https://martin.kleppmann.com/2015/05/11/please-stop-calling-databases-cp-or-ap.html>

# Brewer's CAP “Theorem”

- The CAP theorem series
  - <http://blog.thislongrun.com/2015/03/the-cap-theorem-series.html>

# Data consistency

- Replicated Data Consistency Explained Through Baseball
  - <http://research.microsoft.com/apps/pubs/default.aspx?id=206913>
- Distributed Algorithms in NoSQL Databases
  - <https://highlyscalable.wordpress.com/2012/09/18/distributed-algorithms-in-nosql-databases/>

# Product selection ...

- 101 Questions to Ask When Considering a NoSQL Database
  - <http://highscalability.com/blog/2011/6/15/101-questions-to-ask-when-considering-a-nosql-database.html>
- 35+ Use Cases for Choosing Your Next NoSQL Database
  - <http://highscalability.com/blog/2011/6/20/35-use-cases-for-choosing-your-next-nosql-database.html>

# Product selection ...

- NoSQL Data Modeling Techniques
  - <http://highlyscalable.wordpress.com/2012/03/01/nosql-data-modeling-techniques/>
- Choosing a NoSQL data store according to your data set
  - <http://00f.net/2010/05/15/choosing-a-nosql-data-store-according-to-your-data-set/>
- The Right Database for Your Use Case
  - <http://mprown.github.io/the-right-database-for-your-use-case/>

# Product selection ...

- NoSQL Options Compared: Different Horses for Different Courses
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# Various graphics ...

- G2 Crowd Grid for NoSQL
  - <https://www.g2crowd.com/categories/nosql-databases/>
- Data Platforms Landscape map
  - <https://451research.com/state-of-the-database-landscape/>
- NoSQL LinkedIn Skills Index - September 2015
  - [https://blogs.the451group.com/information\\_management/2015/10/01/nosql-linkedin-skills-index-september-2015/](https://blogs.the451group.com/information_management/2015/10/01/nosql-linkedin-skills-index-september-2015/)

# Various graphics ...

- Necessity is the mother of NoSQL
  - [http://blogs.the451group.com/information\\_management/2011/04/20/necessity-is-the-mother-of-nosql/](http://blogs.the451group.com/information_management/2011/04/20/necessity-is-the-mother-of-nosql/)
- Making Sense of Big Data
  - <http://www.slideshare.net/infochimps/making-sense-of-big-data/>
- NoSQL, Heroku, and You
  - <https://blog.heroku.com/archives/2010/7/20/nosql/>

# Various graphics

- The NoSQL vs. SQL hoopla, another turn of the screw!
  - <http://www.parelastic.com/blog/nosql-vs-sql-hoopla-another-turn-screw/>
- Navigating the Database Universe
  - <http://www.slideshare.net/lisapaglia/navigating-the-database-universe/>

# Discussion fora

- LinkedIn NoSQL
  - <http://www.linkedin.com/groups?gid=2085042>
- LinkedIn NewSQL
  - <http://www.linkedin.com/groups/NewSQL-4135938>
- Google groups
  - <http://groups.google.com/group/nosql-discussion>
- Quora
  - <https://www.quora.com/NoSQL/>

# NoSQL jokes/humour ...

- LinkedIn discussion thread
  - <http://www.linkedin.com/groups/NoSQL-Jokes-Humour-2085042.S.177321213>
- NoSQL Better Than MySQL?
  - <http://www.youtube.com/watch?v=QU34ZVD2yIY>
  - Shorter version of “Episode 1 - MongoDB is Web Scale”
- /dev/null vs. MongoDB benchmark bake-off
  - <http://engineering.wayfair.com/devnull-vs-mongodb-benchmark-bake-off/>

# NoSQL jokes/humour ...

- say No! No! and No! (=NoSQL Parody)
  - <http://www.youtube.com/watch?v=fXc-QDJBXpw>
- BREAKING: NoSQL just “huge text file and grep”, study finds
  - <http://thescienceweb.wordpress.com/2014/10/28/breaking-nosql-just-huge-text-file-and-grep-study-finds/>

# NoSQL jokes/humour ...

- When someone brags about scaling MongoDB to a whopping 100GB
  - [http://dbareactions.tumblr.com/post/62989609976/  
when-someone-brags-about-scaling-mongodb-to-a](http://dbareactions.tumblr.com/post/62989609976/when-someone-brags-about-scaling-mongodb-to-a)
- Trying not to use NoSQL when others do
  - [http://devopsreactions.tumblr.com/post/  
128836122545/trying-not-to-use-nosql-when-others-  
do](http://devopsreactions.tumblr.com/post/128836122545/trying-not-to-use-nosql-when-others-do)

# NoSQL jokes/humour ...

- Interview with the Ghost of MongoDB Scalability
  - <http://blog-shaner.rhcloud.com/interview-with-the-ghost-of-mongodb-scalability/>
- It's Time to Breakup with Your Longtime RDBMS
  - <http://www.marklogic.com/blog/time-breakup-longtime-rdbms/>

# NoSQL jokes/humour

- C.R.U.D.
  - <http://crudcomic.tumblr.com/>
- Twitter
  - @mongodbfacts
  - @BigDataBorat

# Miscellaneous ...

- PowerPoint template
  - <http://www.articulate.com/rapid-elearning/heres-a-free-powerpoint-template-how-i-made-it/>
- Autostereogram
  - [http://www.all-freeware.com/images/full/46590-free\\_stereogram\\_screensaver\\_audio\\_\\_multimedia\\_other.jpeg](http://www.all-freeware.com/images/full/46590-free_stereogram_screensaver_audio__multimedia_other.jpeg)
- Theatre Curtain Animations
  - <http://www.slideshare.net/chinateacher1/theater-curtain-animations/>

# Miscellaneous ...

- Icons and images
  - <http://www.geekpedia.com/icons.php>
  - <http://cemagraphics.deviantart.com/>
  - <http://www.freestockphotos.biz/>
  - <http://www.graphicsfuel.com/2011/09/comments-speech-bubble-icon-psd/>
  - <http://www.softicons.com/free-icons/>
  - <http://icondock.com/>

# Miscellaneous

- Newspaper headlines
  - <http://www.imagechef.com/t/n8rm/Newspaper-Headline/>

# Backup headlines















Source: Inspired by “BREAKING: NoSQL just ‘huge text file and grep’, study finds” jovialscientist (28 October 2014)